
Representing the Impact of Residential Energy Choice and Land Use Change on the Climate and Air Quality of Sub-Saharan Africa

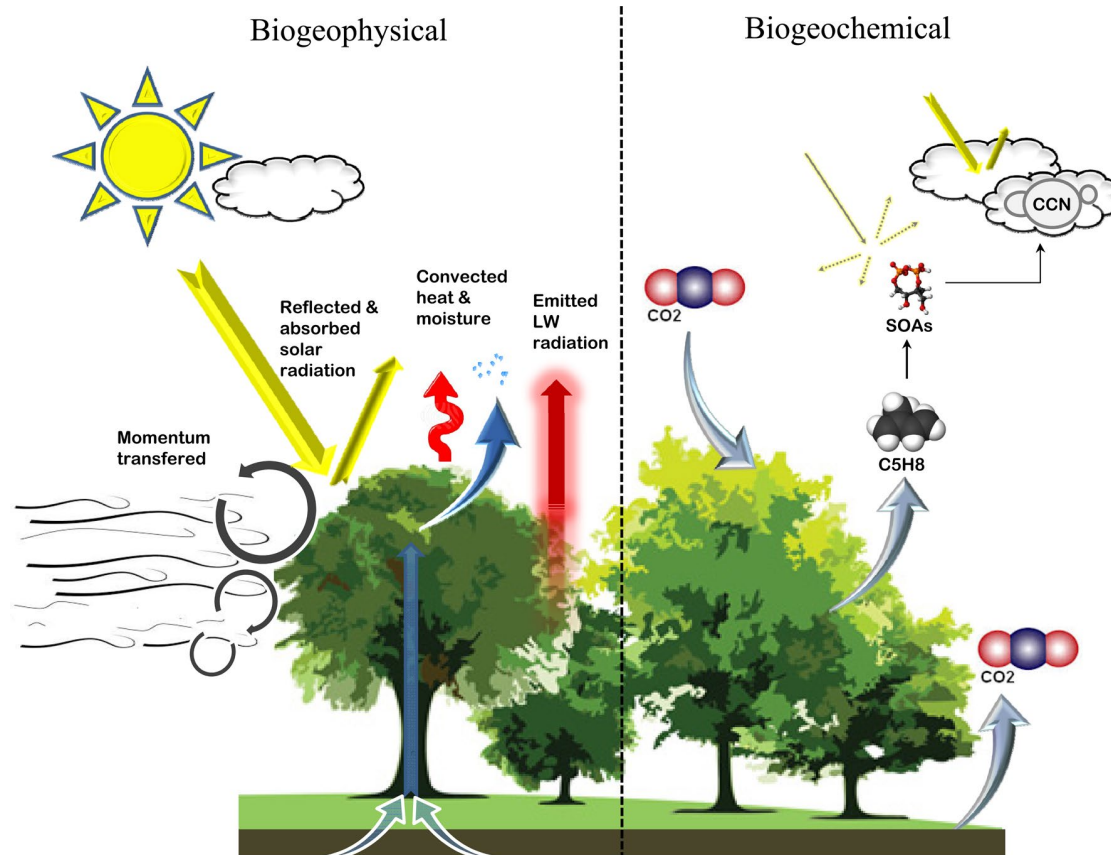
Timothy Glotfelty, Diana Ramirez-Meija, Jared
Bowden, Adrian Ghilardi, Yang Ou, Ashley Bittner,
Andrew Grieshop, Robert Bailis, Pamela Jagger, and
J. Jason West

The 19th Annual CMAS Conference
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THE UNIVERSITY
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Land Use and Land Cover Impacts on Climate

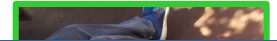


Bright et al., 2015

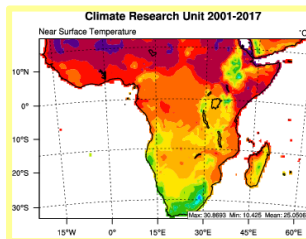
Africa Coupled Natural Human Systems Project



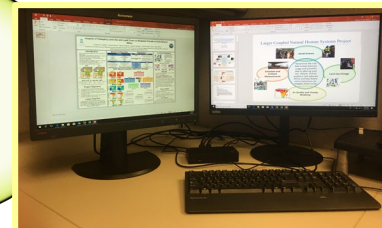
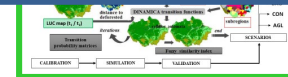
Social Science



Understand the current and future impacts of land use and residential energy choice on the climate and air quality of Sub-Saharan Africa

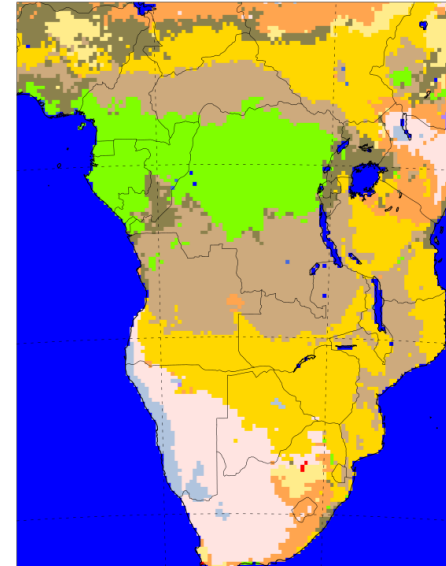


Air Quality and Climate Modeling



WRF-Chem Configurations

- WRF-Chem Domain Configuration
 - Area: Limited Sub-Saharan Africa
 - Horizontal Grid Spacing: 36 km
 - Vertical: 30 layers from the surface to 50mb
 - IC/BC: ERA-Interim (Met.) and CAM-Chem (Chem.)
- Physics Options
 - Cumulus: Grell 3D
 - Microphysics: Morrison Double-Moment
 - **Land Surface Model: CLM-AF**
 - Surface and Boundary Layer: MYNN
 - Radiation: RRTMG
 - Active Lake Simulation



- Chemistry Options
 - Gas-Phase: MOZART-VBS
 - Aerosol: MOSAIC-4 Bin
 - Photolysis: TUV
 - Dust Emission: GOCART-AFWA
 - Sea-Salt Emission: MOSAIC
 - Biogenic Emission: MEGAN
 - Active Plume rise Biomass Burning



Simulations

- Current Conditions (2001-2017)
 - Simulations
 - Baseline: Emissions and land use change from year to year
 - LU01: Land use and land cover are held constant at the year 2001 values
 - EM01: Emissions are held constant at the year 2001 values
- Future Conditions (2035-2044)
 - Simulations
 - Business as Usual (BAU)
 - Current trends continue
 - Shared Socioeconomic Pathway: SSP3
 - Cleaner residential energy scenarios
 - Electricity
 - Liquefied Petroleum Gas (LPG)

Necessary Steps to Achieve WRF-Chem Modeling Objectives

- 1) Simulate logical changes in climate from land use and land cover change (100% Complete)
- 2) Harmonize changes in land use and land cover to natural biogenic VOC and dust emissions (50% Complete)
- 3) Develop an emissions inventory to adequately account for residential energy choices in Africa (80% Complete)
- 4) Project future emissions based on African residential energy scenarios (50 % Complete)

Step 1: Land Use Modeling Regions

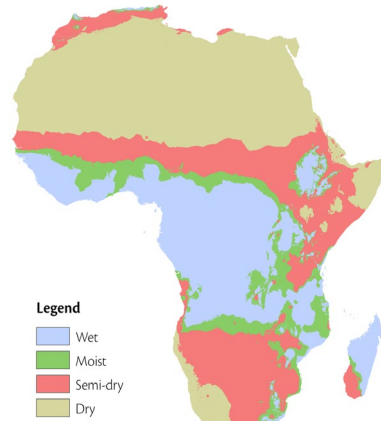
18 regions based on:

- CLIMATE ZONES
- SOCIO-ECONOMIC & ANTHROPOGENIC FACTORS

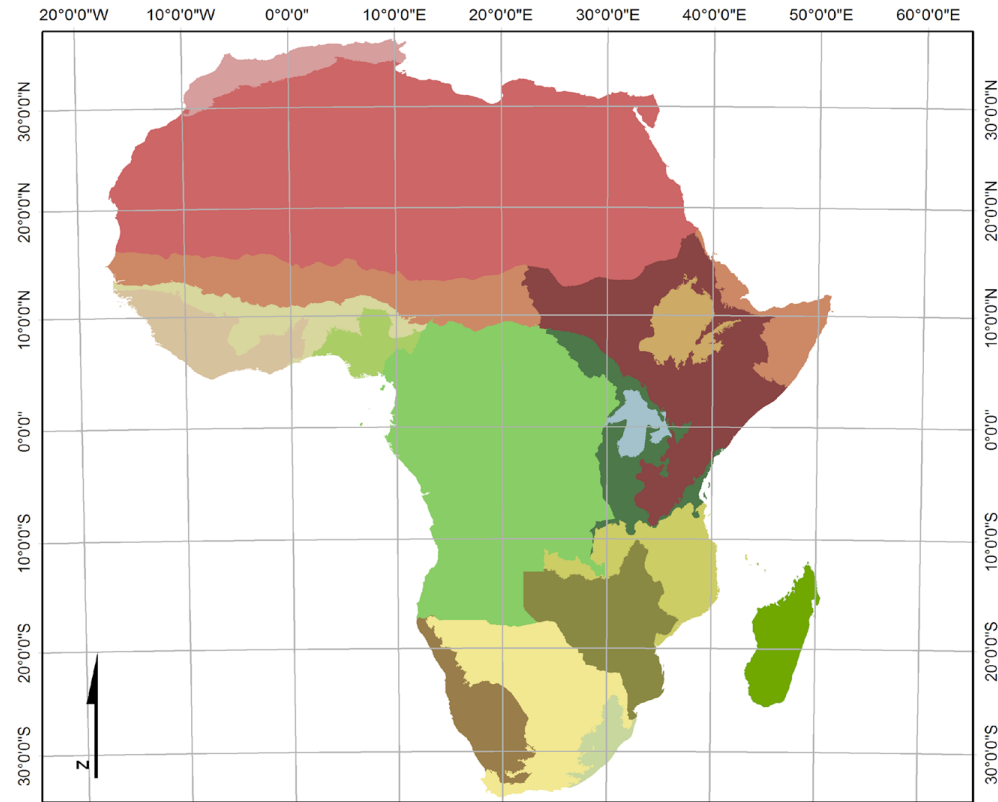
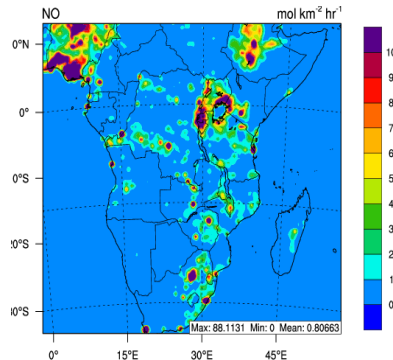
UN Geographic Region



Bio-climate Regions



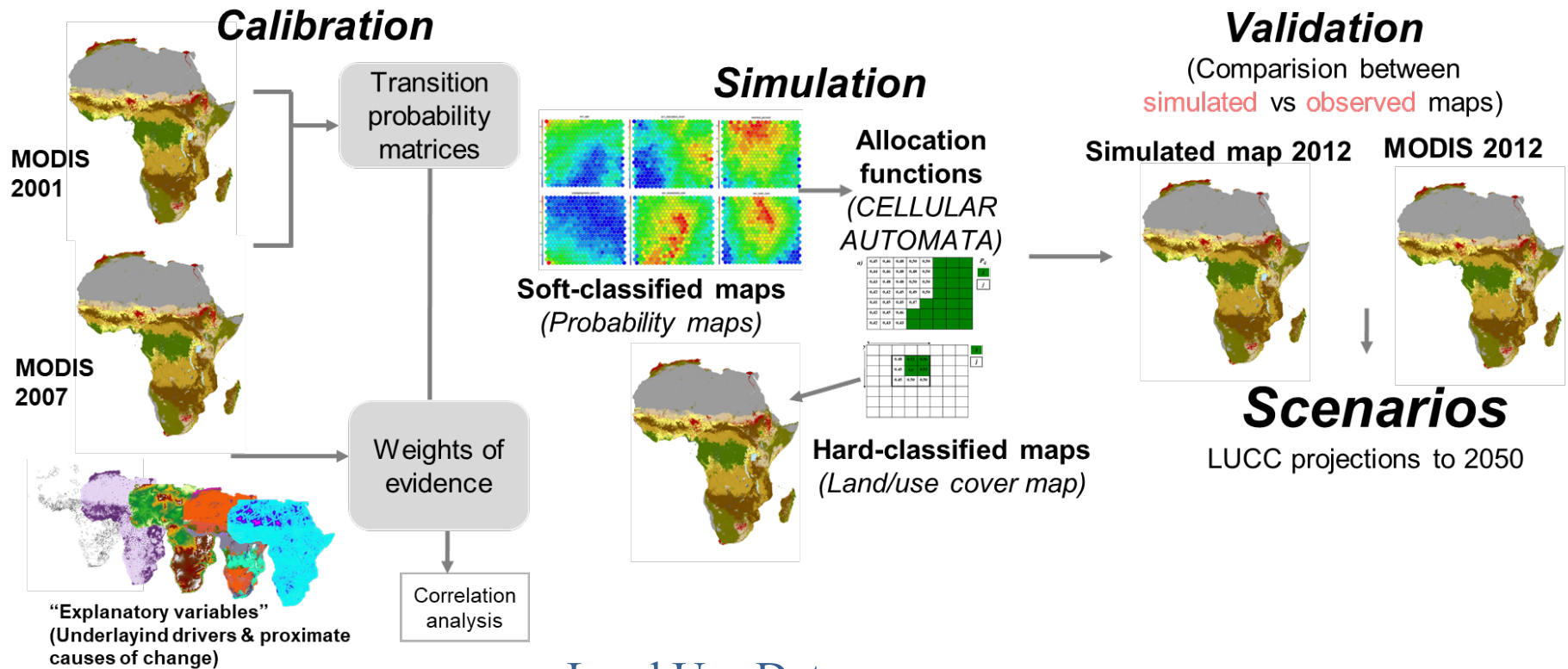
Anthropogenic Activity Regions



Subregions

- | | | |
|-----------------------------------|---------------------------------|---------------------------|
| 1. North Semi-Dry | 7. West Moist | 13. East Moist |
| 2. North Dry | 8. West Wet | 14. Southeast Semi-Dry |
| 3. East Dry | 9. Central Wet | 15. East Wet / Madagascar |
| 4. East Semi-Dry | 10. West Wet / Nigeria | 16. South Dry |
| 5. West Semi-Dry | 11. Central Moist | 17. South Semi-Dry |
| 6. East Wet / Ethiopian Highlands | 12. Central Wet / Lake Victoria | 18. South Moist / Wet |

Step 1: Land Use Modeling (Dinamica EGO)



■ Land Use Data

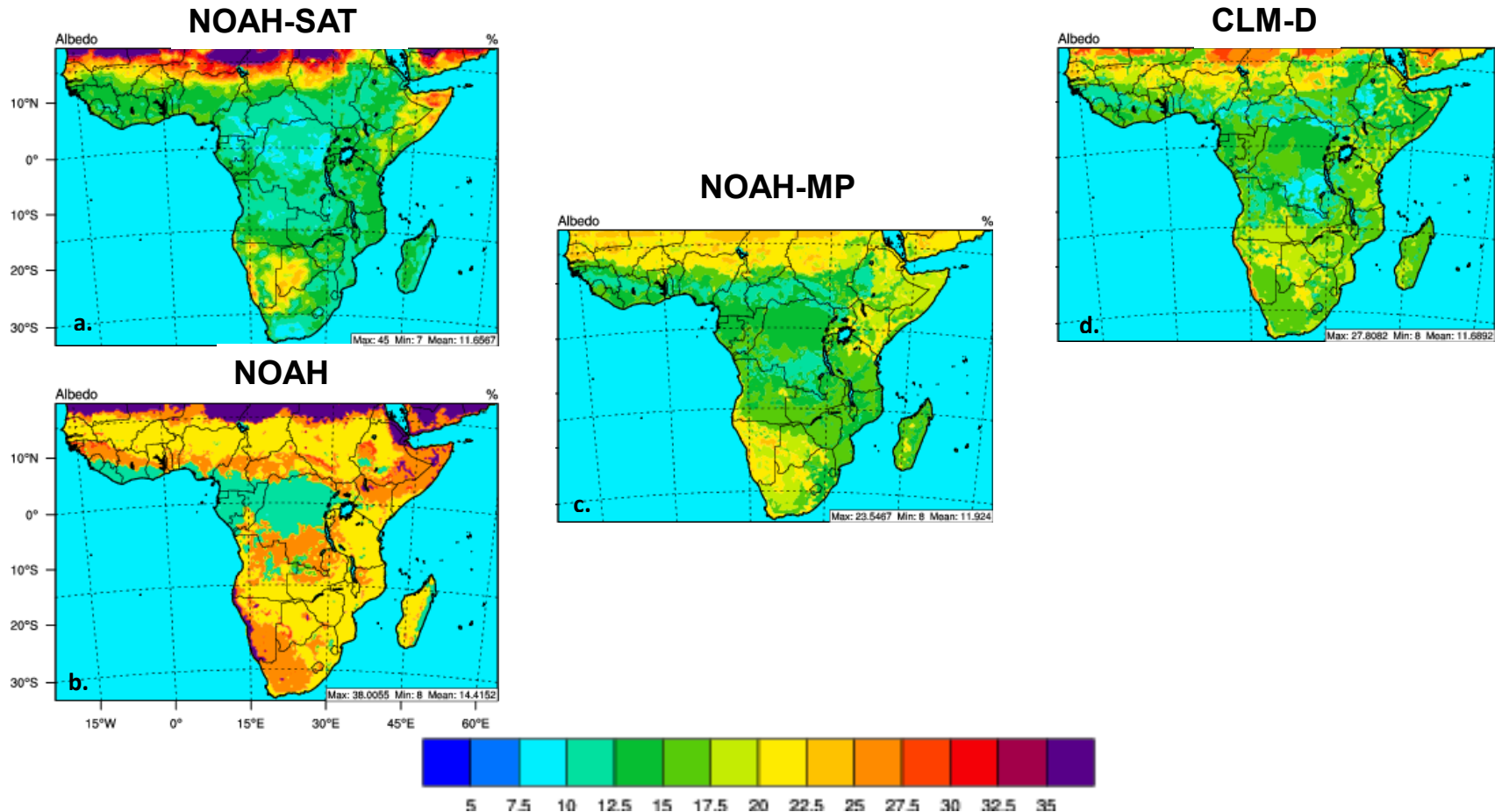
- MODIS MCD12Q1 Product
- Training Period: 2001-2007

■ Why Dinamica EGO?

- Used to avoid noise from uncertainty in satellite products
- MODIS products only available to 2013



Step 1: Deficiencies in WRF land Surface Models (Albedo)



Glotfelty, T., Ramírez-Mejía, D., Bowden, J., Ghilardi, A., and West, J. J.: Limitations of WRF land surface models for simulating land use and land cover change in Sub-Saharan Africa and development of an improved model (CLM-AF v. 1.0), *Geosci. Model Dev. Discuss.*, <https://doi.org/10.5194/gmd-2020-193>, in review, 2020.

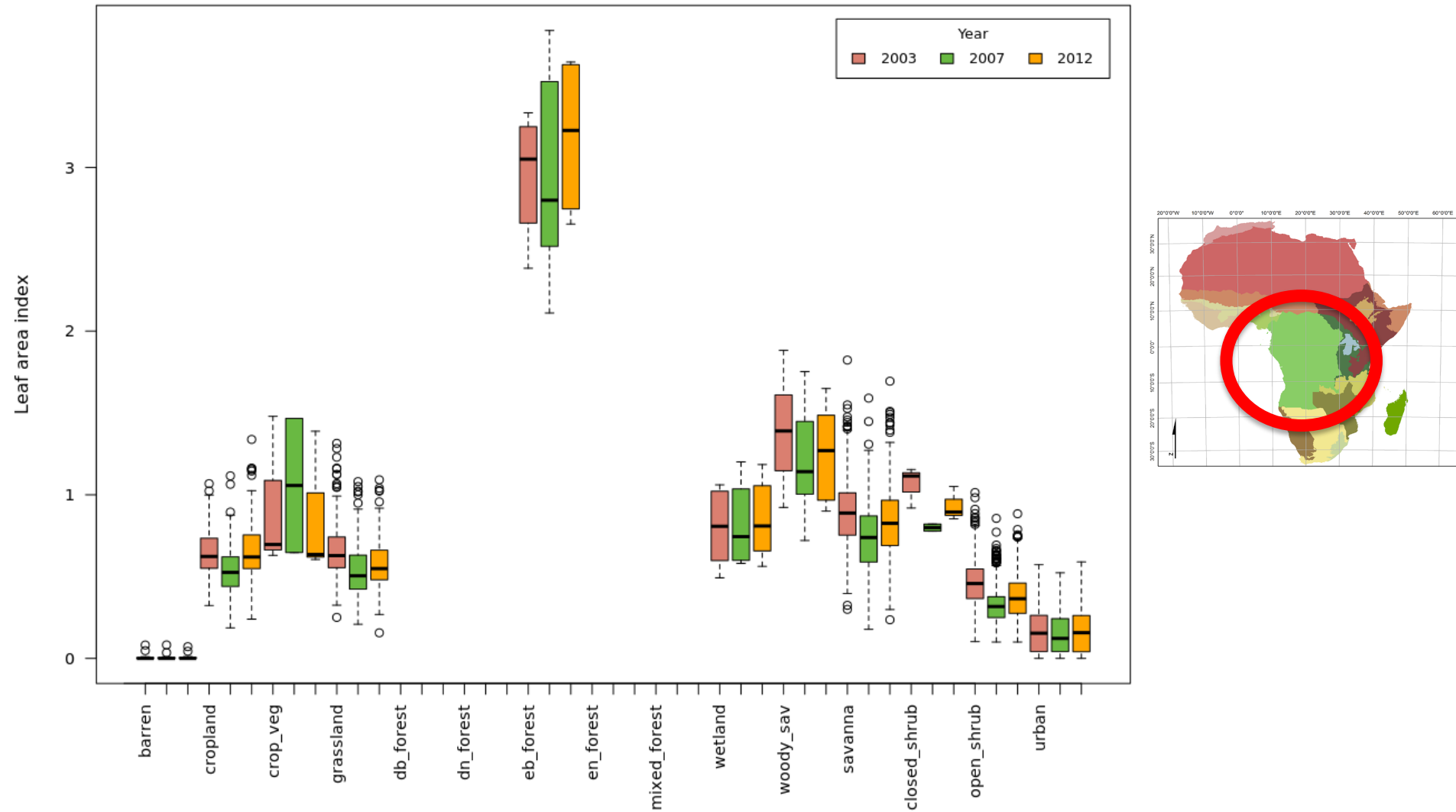
Step 2: LULC Dependent Natural Emissions Input Datasets

- GOCART-AFWA
 - Soil Erodability
- MEGAN
 - Leaf Area Index
 - Plant Functional Types
 - Needle Leaf Trees
 - Broad Leaf Trees
 - Shrubs
 - Herbaceous Cover
 - Isoprene Emission Factors



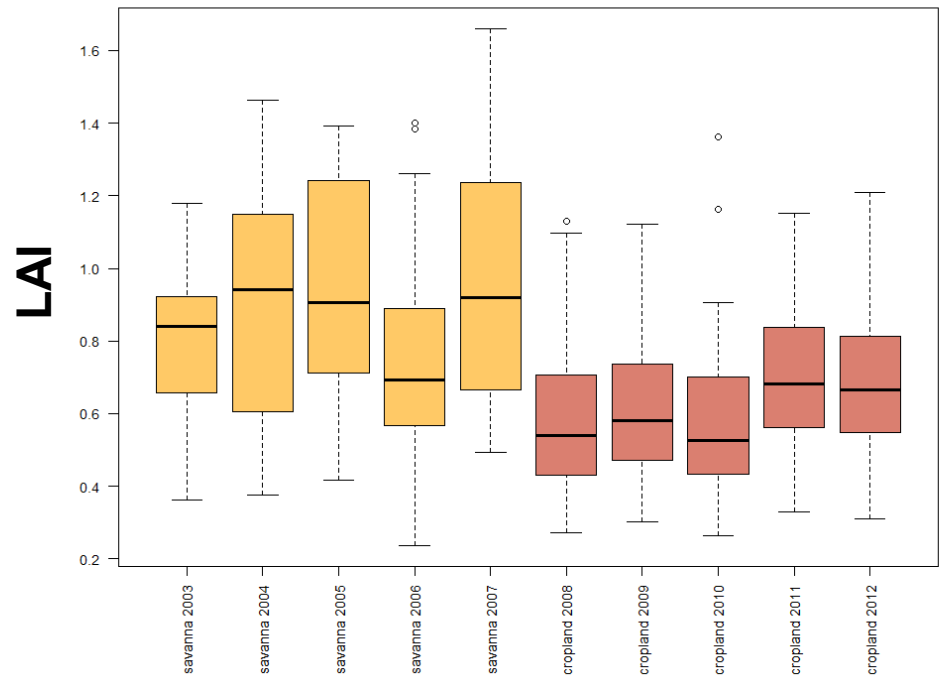
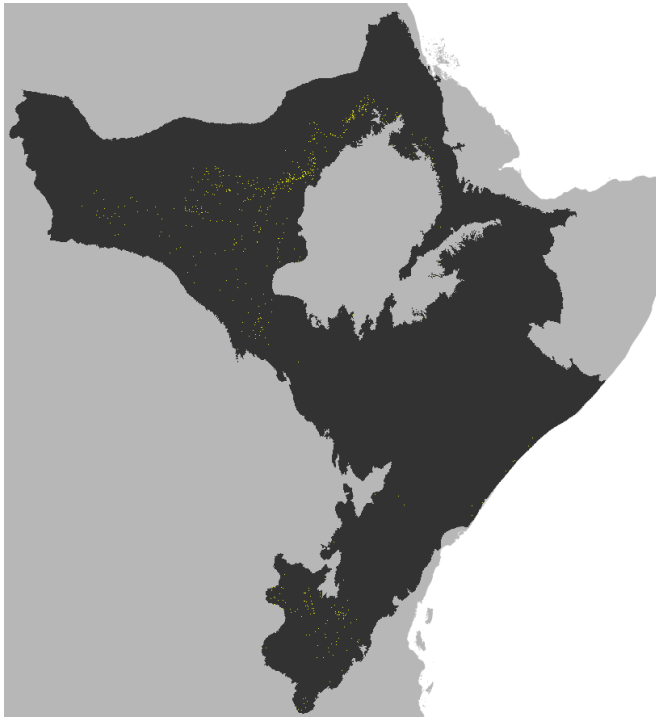
Step 2: LAI and LULC Relationship

LAI Central Wet



Step 2: LAI and LULC Relationship

LAI Transition East Semi-Dry



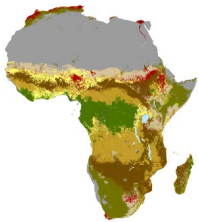
Yellow cells depict areas that underwent change from savanna to cropland in 2008

Step 2: Reclassification Methodology

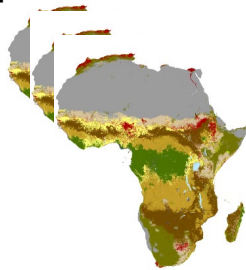
STEP

1 **LUC maps pairs** are compared to identify cells that change

LUC MODIS 2003
(observed)

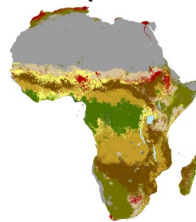


LUC “simulated”
maps 2001 - 2003



≠

monthly (12 layer
stack) LAI MODIS
2003 (observed)



RECLASSIFICATION
BASED ON RULE 1
AND RULE 2:
monthly LAI maps
2001-2003
“simulated”

Rule 1: for cells that **do not change**,
monthly LAI values from 2003
(observed) are assigned (i.e.
reclassification)

Rule 2: for cells that **do change**, the
average monthly LAI values of
neighbour cells for each corresponding
LUC class are assigned (in a moving
window of 9x9 cells)

Result: Monthly LAI maps 2001-2003
“simulated”

LUC 2003 obs

A	A	A	B	B
B	B	B	C	C
C	C	C	C	C
C	C	C	C	C

≠

LUC 2002 sim

A	A	B	B	B
B	B	B	C	C
C	C	C	C	C
C	C	A	A	A

LAI 2003 obs
(1 out of 12 values)

0.2	0.3	0.1	1.1	1.0
1.3	1.2	1.0	3.1	3.5
3.2	3.3	3.6	3.2	3.4
3.3	3.1	3.2	3.1	3.4



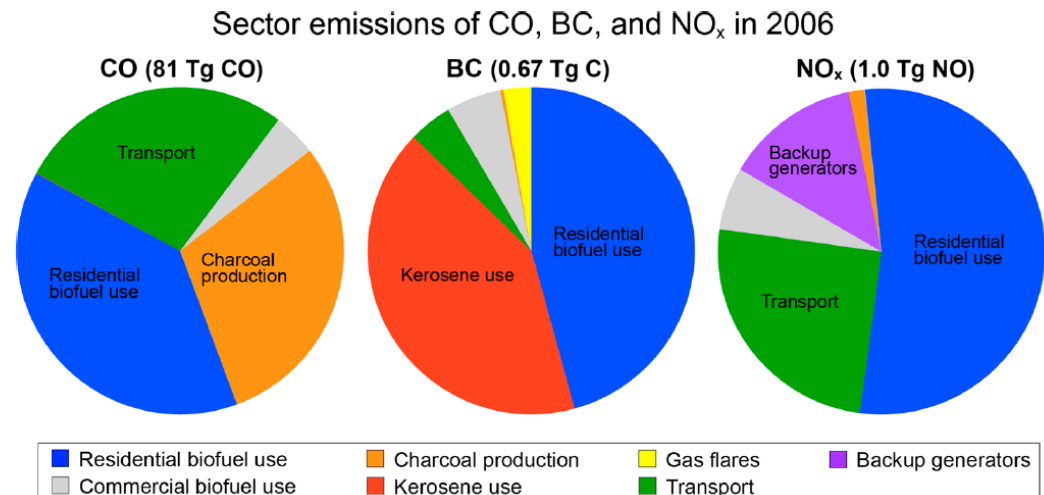
LAI 2002 sim

0.2	0.3	?	1.1	1.0
1.3	1.2	1.0	3.1	3.5
3.2	3.3	3.6	3.2	3.4
3.3	3.1			

1.1

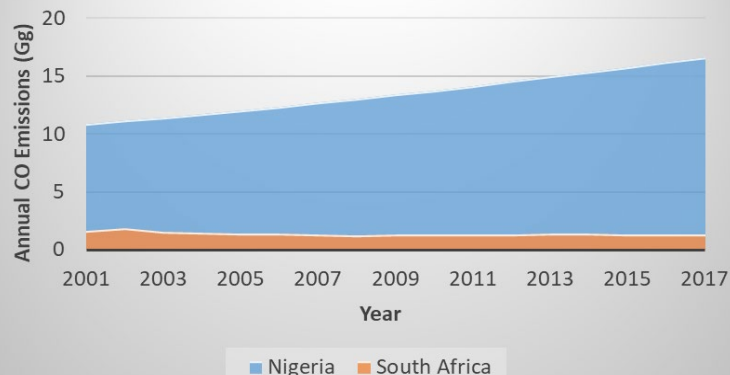
Step 3: DICE-Africa Emissions

- DICE-Africa (Marais and Wiedinmyer, 2016)
 - African inventory for Diffuse and Inefficient Combustion Emissions (DICE)
 - Years: 2006 and 2013
 - Derived from UN Estimates of Fuel Consumption (<http://data.un.org/Explorer.aspx?d=EDATA>)
 - Country Level Emissions
 - Residential Sources
 - Fuelwood, Charcoal, Charcoal Production, Household Generators, Crop Residue, and Kerosene
 - Transportation Sources
 - Cars and Motorcycles
 - Other Sources
 - Gas Flares and Oil Refining



Step 3: DICE-Africa Methodology to Generate 2001-2017 Inventory

Household Fuelwood



Fuelwood Change
Nigeria: 53%
South Africa: -20%

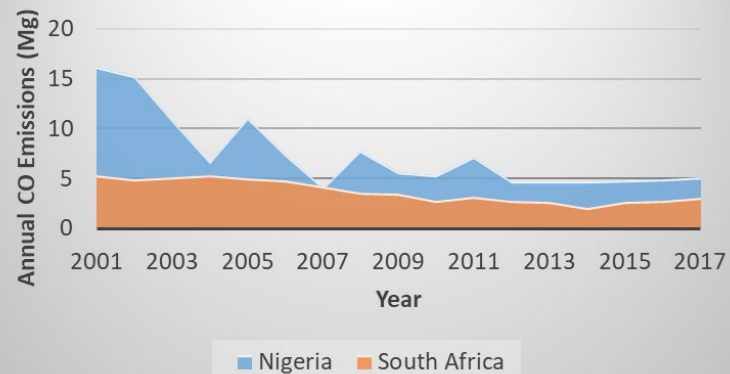
Household Charcoal Use



Charcoal Change
Nigeria: 199%
South Africa: 8983%

Kerosene Change
Nigeria: -69%
South Africa: -42%

Household Kerosene



Production Change
Nigeria: 204%
South Africa: -55%

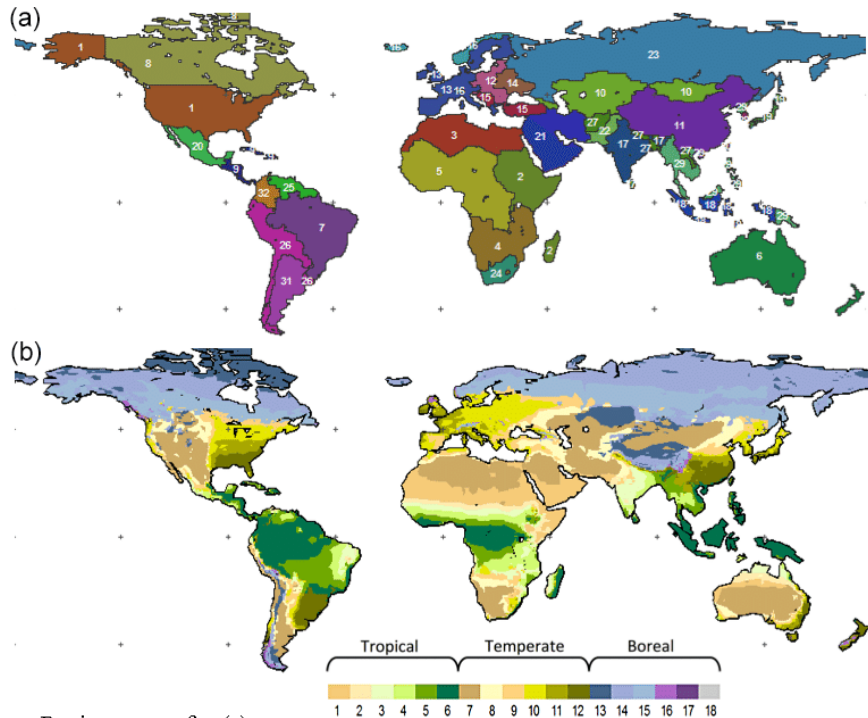
Charcoal Production



Step 4: Future Scenarios Residential Energy Projections (2040)

- Business As Usual (BAU)
 - Extrapolating current UN trends into the future
 - Fuelwood, charcoal, and crop residues remain the major residential fuel sources
- LPG
 - Biomass fuel sources are phased out by 2040 and primarily replaced with LPG
- Electricity
 - Biomass fuel sources are phased out by 2040 and primarily replaced with electricity
- We are projecting the DICE-Africa inventory
 - Works well for the residential sector
- What about the other emissions sectors?
 - SSP Historical Emissions for the current period

Step 4: Global Change Analysis Model (GCAM)



Region names for (a)

1- USA	9- Central America and Caribbean	17- India	25- South America Northern
2- Africa Eastern	10- Central Asia	18- Indonesia	26- South America Southern
3- Africa Northern	11- China	19- Japan	27- South Asia
4- Africa Southern	12- EU-12	20- Mexico	28- South Korea
5- Africa Western	13- EU-15	21- Middle East	29- Southeast Asia
6- Australia NZ	14- Europe Eastern	22- Pakistan	30- Taiwan
7- Brazil	15- Europe Non EU	23- Russia	31- Argentina
8- Canada	16- European Free Trade Association	24- South Africa	32- Colombia

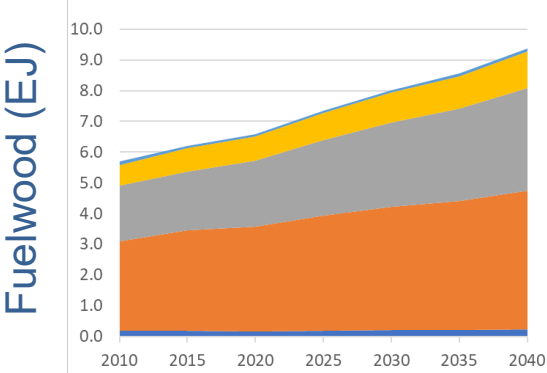
Le Page et al., 2016

■ GCAM

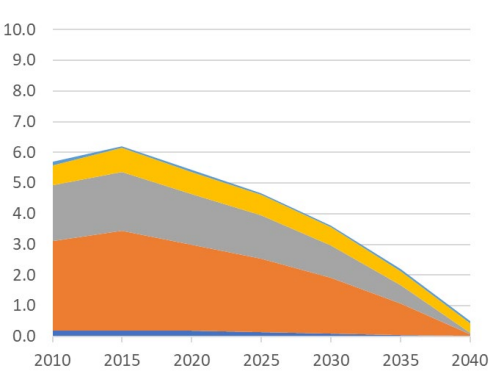
- Integrated assessment/ economic model
- Simulates Africa in 5 regions
 - Northern, Southern, Western, Eastern, and South Africa
- We utilize the GCAM's Shared Socio Economic Pathway SSP3 scenario
 - Storyline is the closest to our BAU scenario
- Use demand/pricing constraints to mirror our residential energy projections
- Generate emission sectors consistent with our residential energy projections
 - power generation, industry, transportation, agriculture, etc...

Step 4: Future Scenarios Residential Energy Projections (2040)

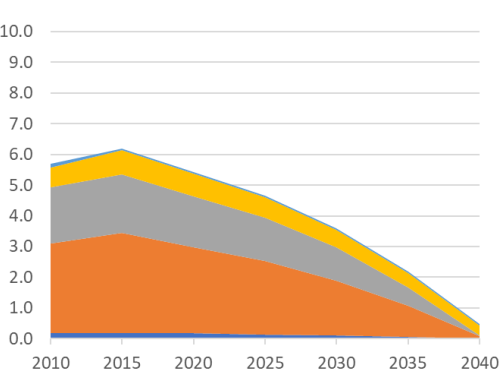
BAU



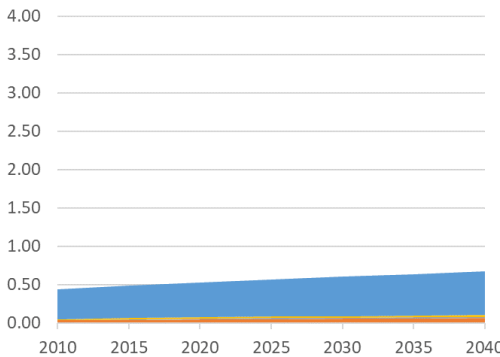
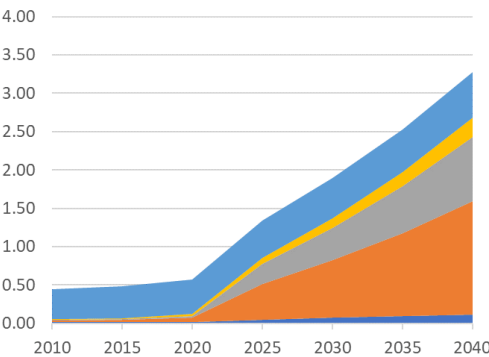
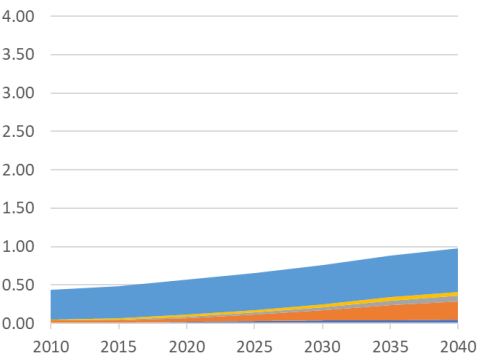
LPG



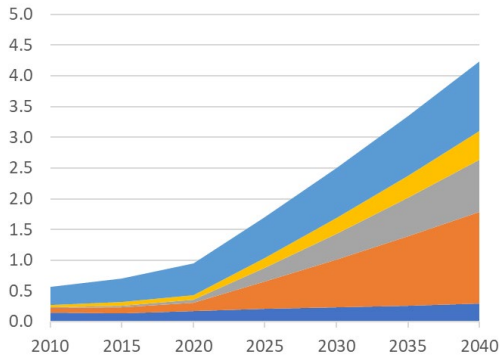
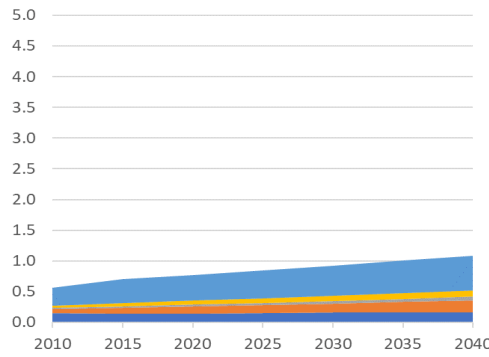
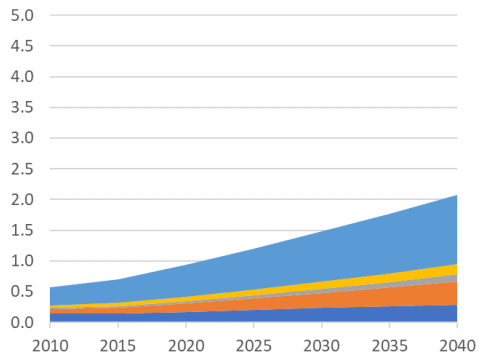
ELEC.



LPG (EJ)



Electricity (EJ)



- South_Africa
- Africa_Western
- Africa_Eastern
- Africa_Southern
- Africa_Northern

YEAR

Conclusions

- Fully representing the impact of land use and land cover on both climate and air quality in Sub-Saharan Africa is challenging with the current status of most publically available modeling tools
 - We have created CLM-AF to better simulate land use change in Africa
- More detailed country level emission inventories are needed to better understand the impacts of changing emissions in Sub-Saharan Africa
- The methodology discussed here provides a pathway forward for simulating these impacts in both Africa but also other developing regions of the world
- More work is needed in the future to truly harmonize these processes in regional climate models



Future Work

- Finish the reclassification for all datasets needed by WRF-Chem
- Finalize the DICE-Africa style gridded emissions
- Finalize the details of the future scenarios and conduct GCAM simulations to mirror these scenarios
- Conduct WRF-Chem simulations to elucidate the impacts of land use change and residential energy choice on the climate and air quality of Sub-Saharan Africa



Thank you

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- Eloise Marais and Christine Wiedinmyer

