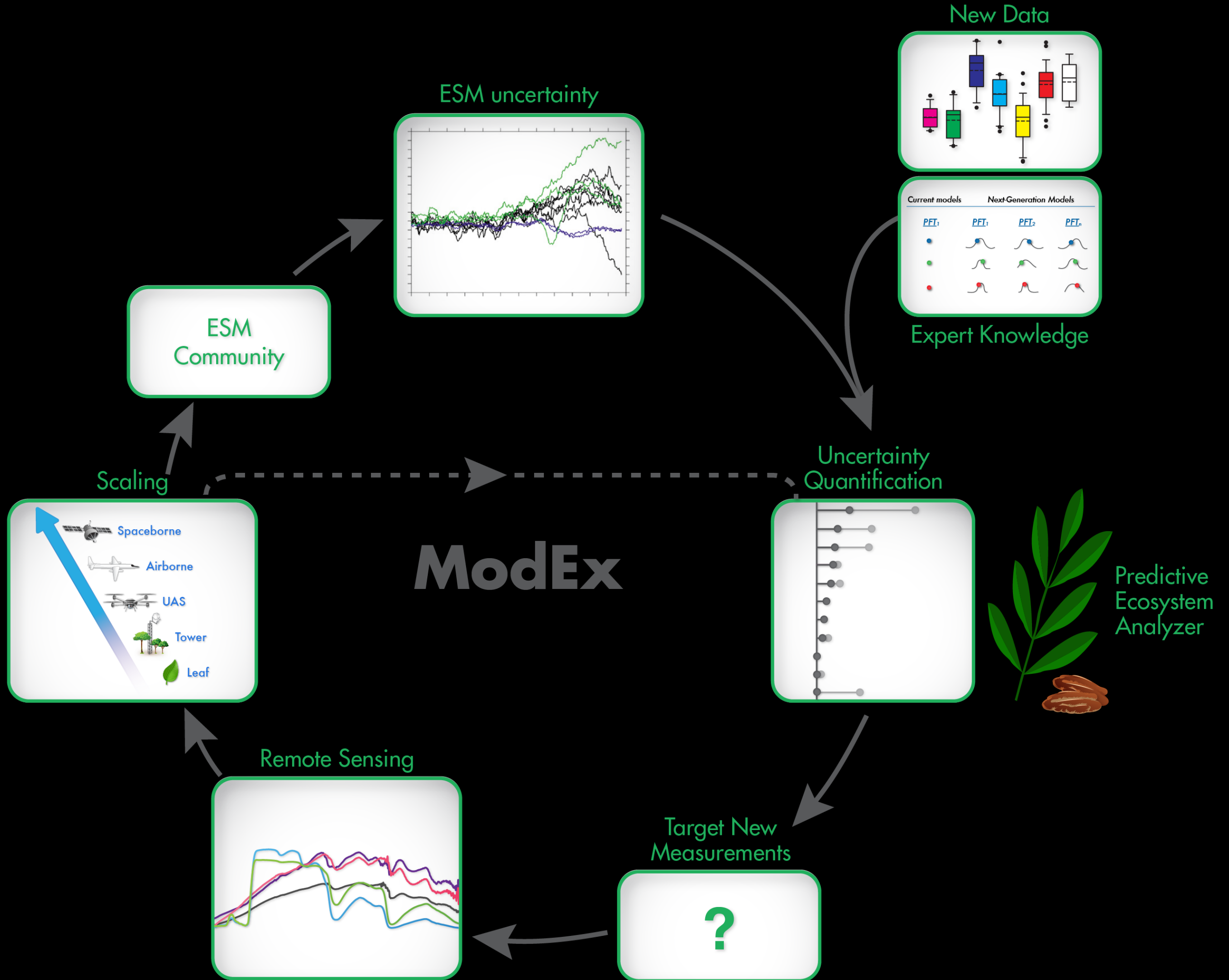


PEcAn: A community tool to enable synthesis, evaluation, & forecasting

SHAWN SERBIN & PEcAn TEAM



@PEcAnProject
@doctorjackpine



CHALLENGES

- Data synthesis:
volume, diversity
- Modeling not scalable
- Models are not accessible

MULTI-MODEL VALIDATION
TAKES YEARS

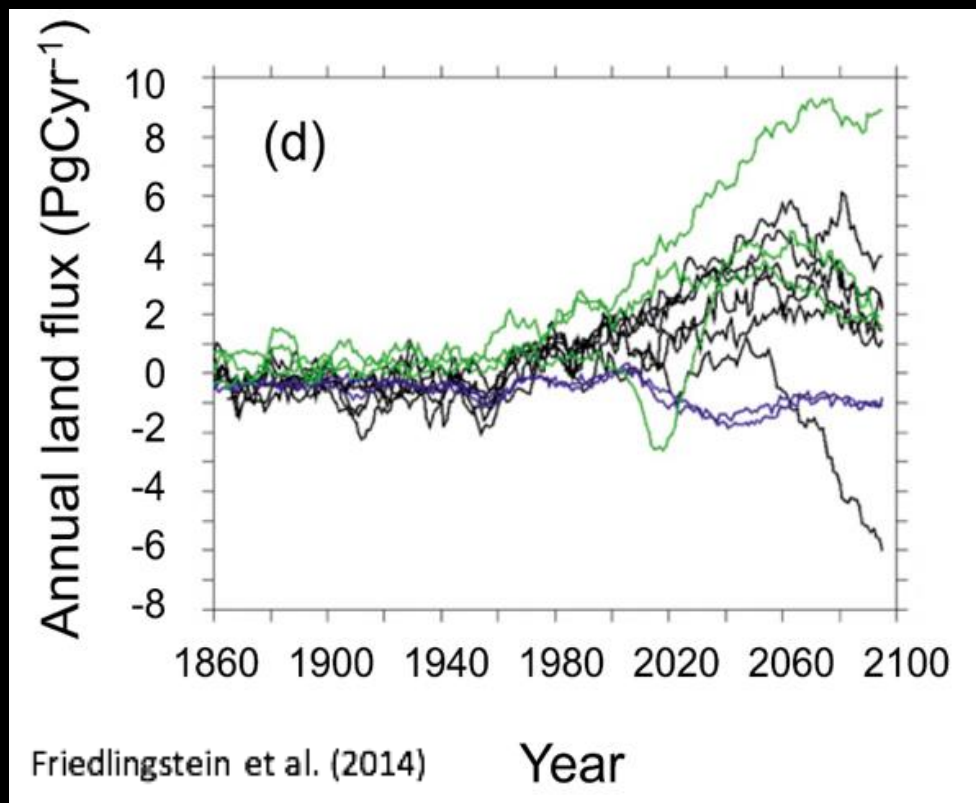
ONLY FRACTION OF DATA
BEING USED

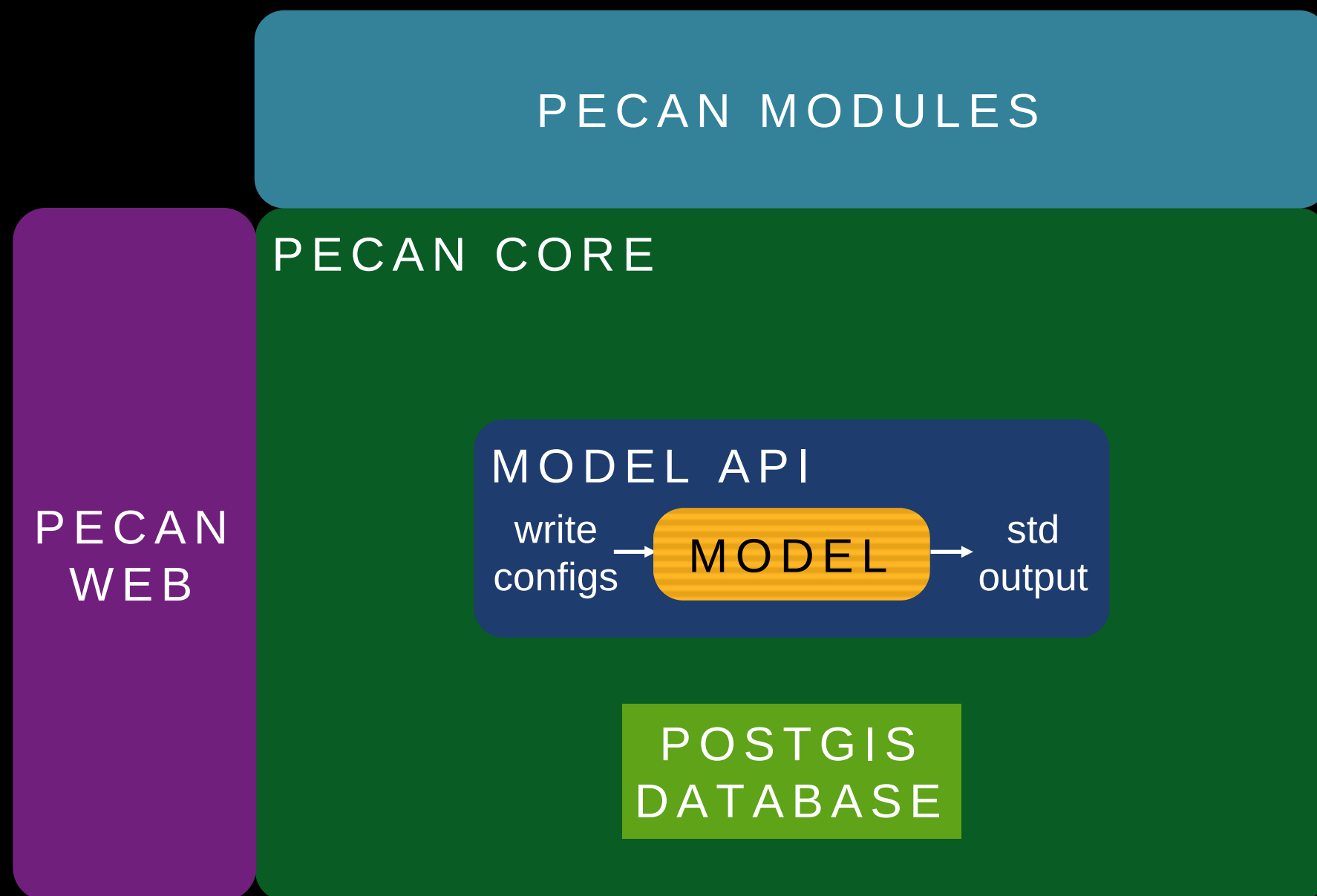
MODELING IS A COTTAGE
INDUSTRY

INPUTS, OUTPUTS, AND
ANALYTICAL TOOLS NOT
STANDARDIZED

NOT SHARED OR
REPLICABLE

NO EASY WAY FOR NON-
MODELERS TO HELP





Standardized inputs and outputs

Provenance: Transparent & Repeatable

Accessible interface

Reusable tools for execution, analysis, visualization

Terrestrial Ecosystem Scier

PEcAn Site/Model Selector

BETYdb: /models

pecan.book/Installing-PEcAn

Missing dependency for R

https://modex.bnl.gov/pecan/02-modelsite.php

Select host

Based on the host selected certain sites and models will be available.

Host:

modex.bnl.gov

Model:

All Models

SIPNET (unk)

MAAT_Model (dev_ngeet)

LPJ-GUESS (v3.1)

LINKAGES (R_version)

LINKAGES (Revision 1.0 Ann's hack)

ED2 (git)

ED2 (85)

ED2 (82)

ED2 (81)

ED2 (46)

DALEC (Quaife Evergreen RSE08)

BioCro

worknow

Select a site to continue

PrevNext

Logged in as Shawn P. Serbin

logout

MapSatellite

Google

Turks

Map data ©2016 Google, INEGI

Terms of Use

PEcAn Version 1.4.6

Selected Site
Set parameters for the run.

PFT* (Show in BETY)
luquillo.late_tropical
populus
temperate.coniferous
temperate.deciduous
temperate.needleleaf.Llpinebar

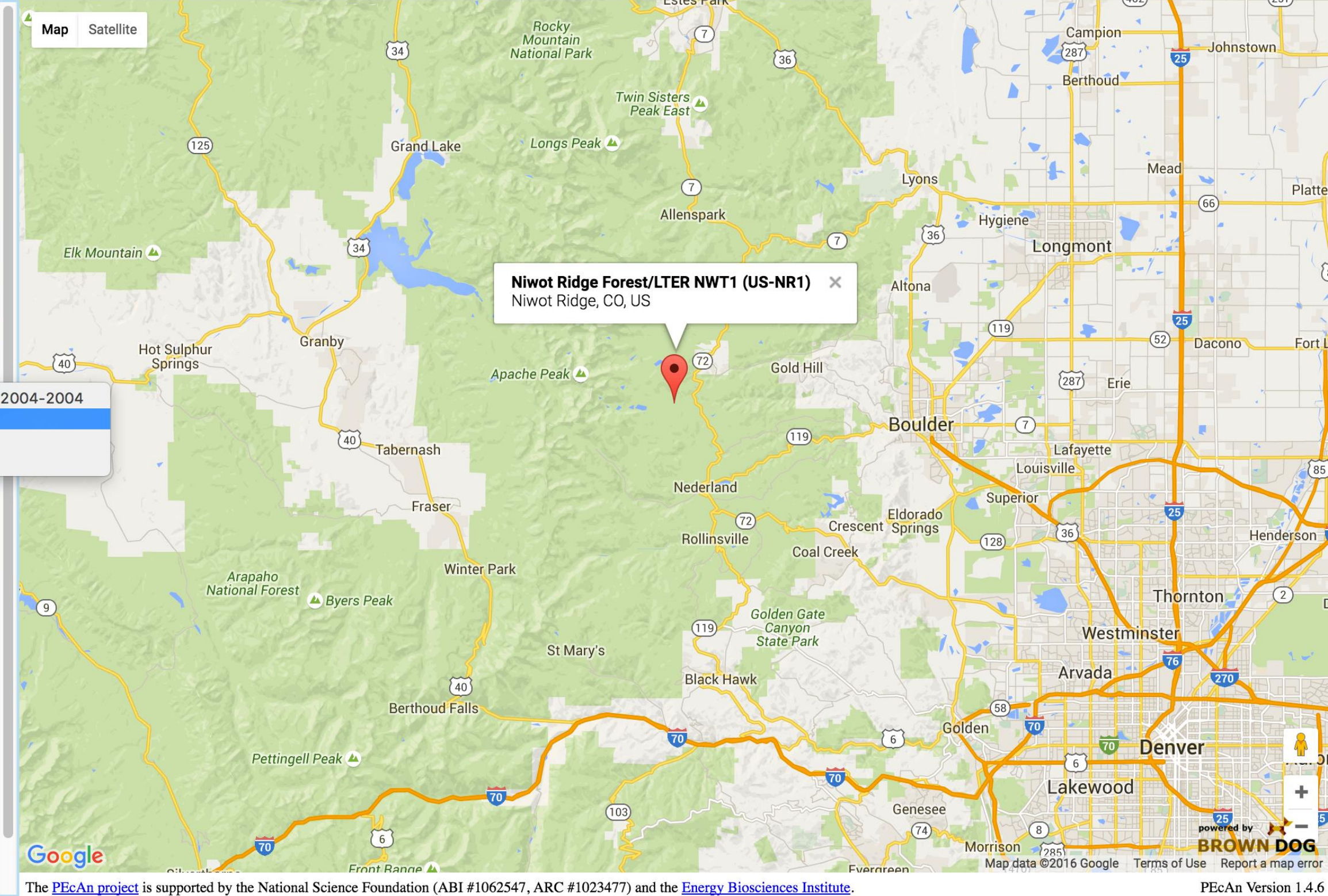
Start Date*
2004/01/01

End Date*
2004/12/31

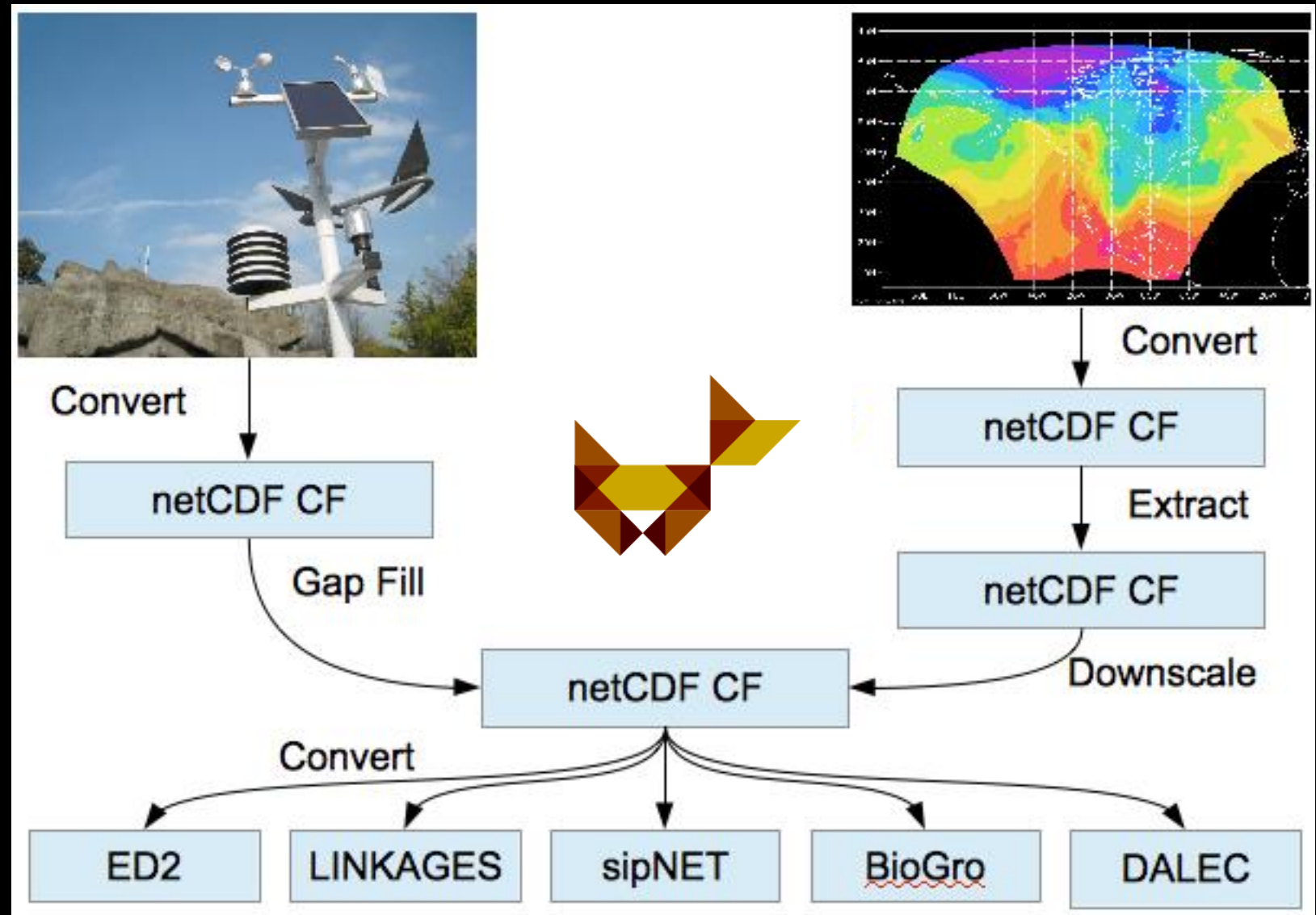
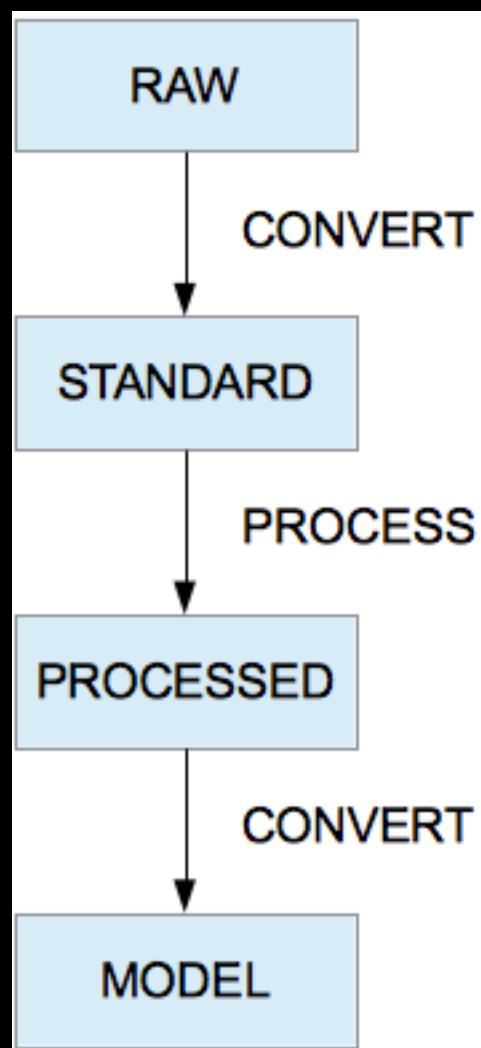
Sipnet.climna* (Show in BETY)
✓ Ameriflux_SIPNET_site_0-772 2004-2004
Use Ameriflux
Use NARR
Use CRUNCEP

Use BrownDog
✓
Edit pecan.xml
✓
Edit model config
☐
Advanced setup
✓
* are required fields.

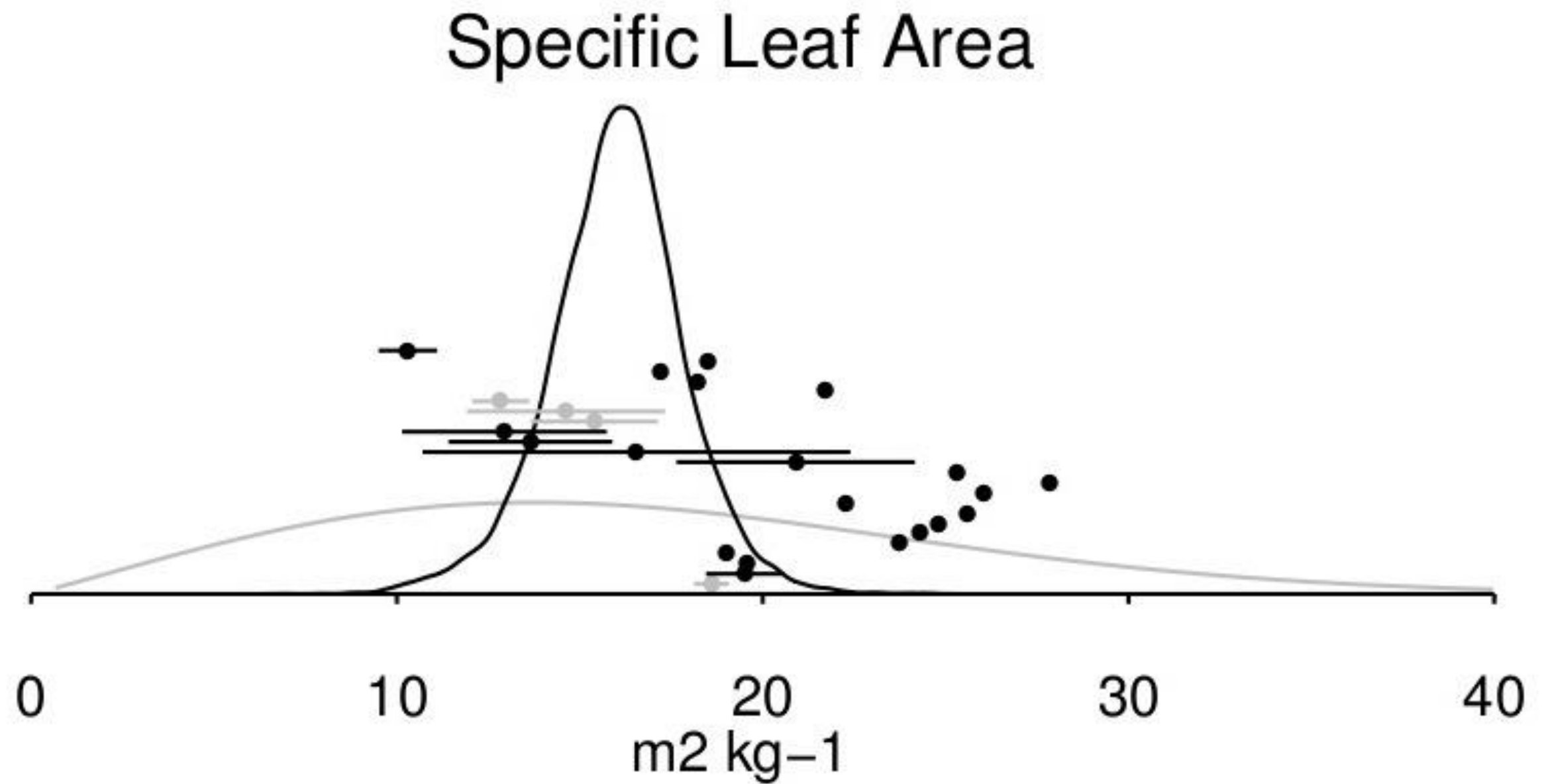
PrevNext



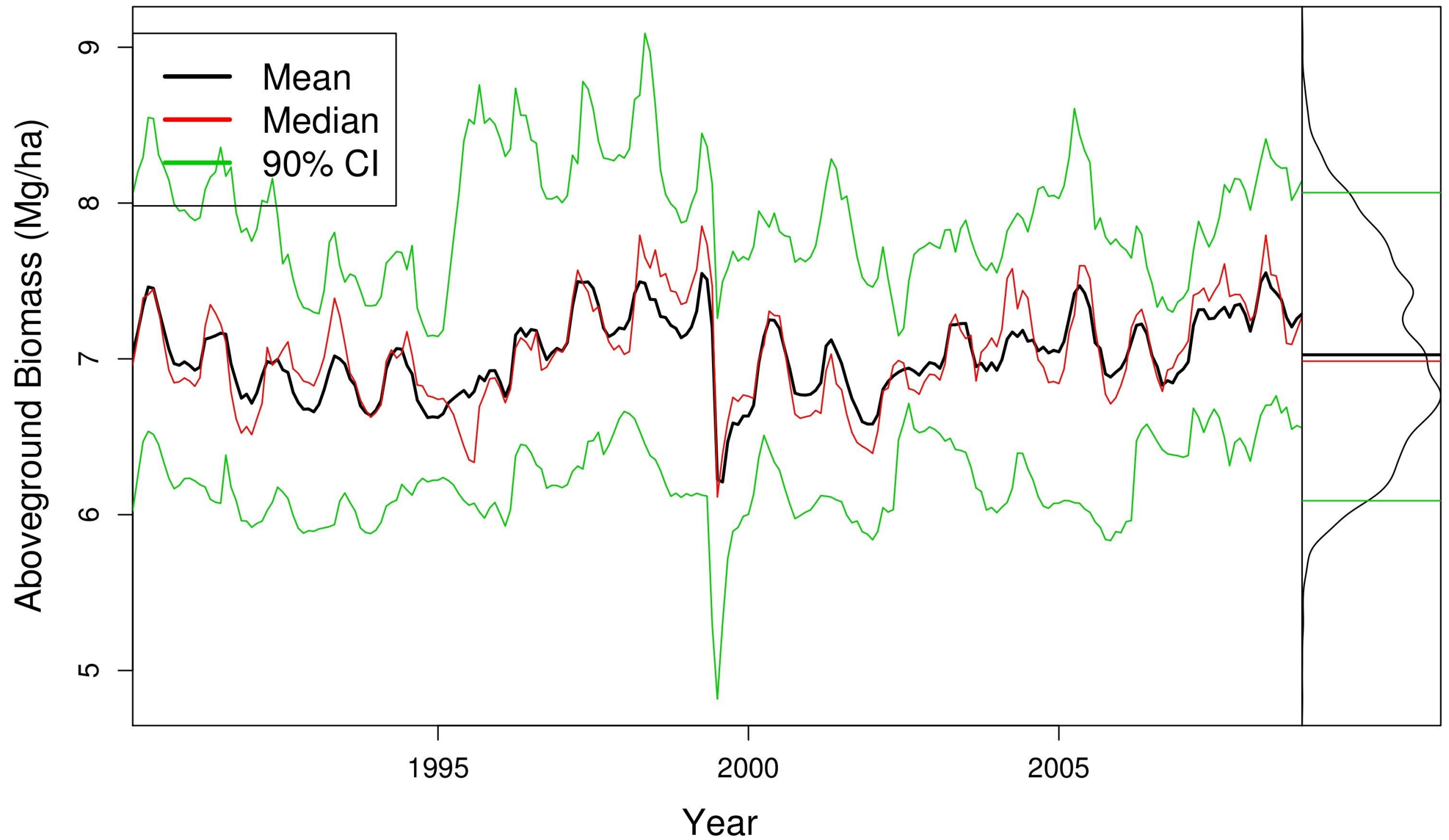
INFORMATICS MODULES



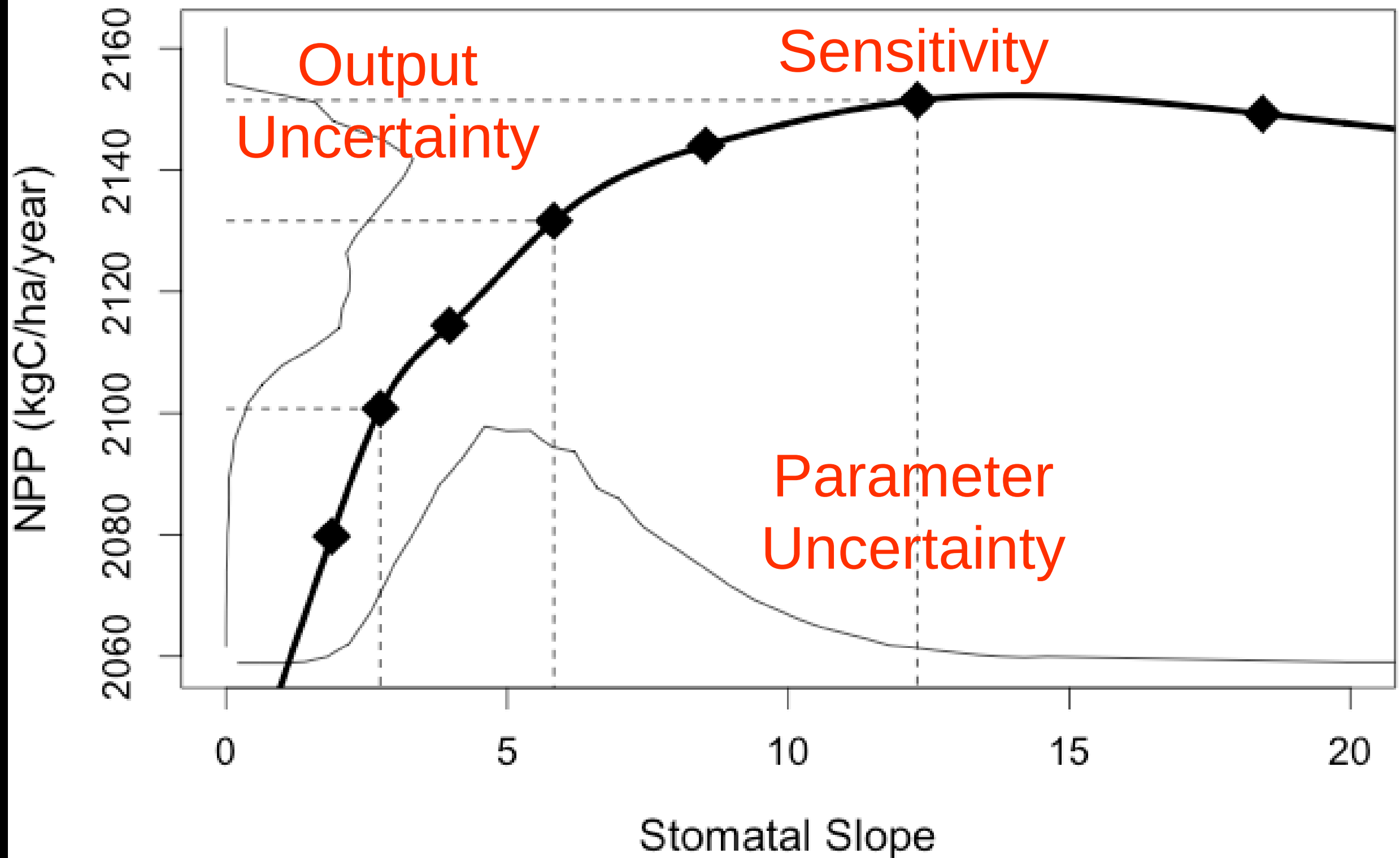
META ANALYSIS POSTERIORIORS



ENSEMBLE ESTIMATE

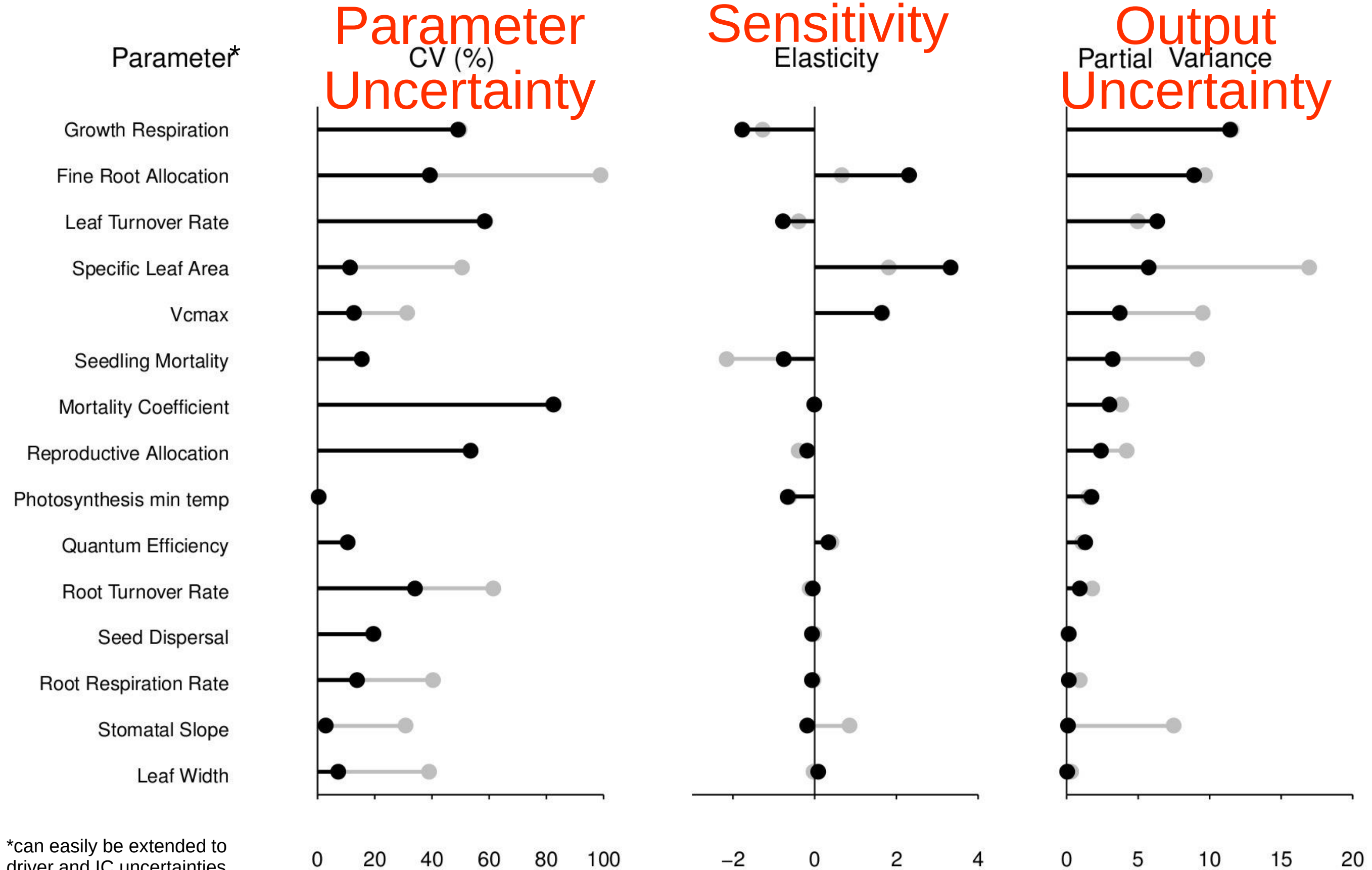


UNCERTAINTY QUANTIFICATION



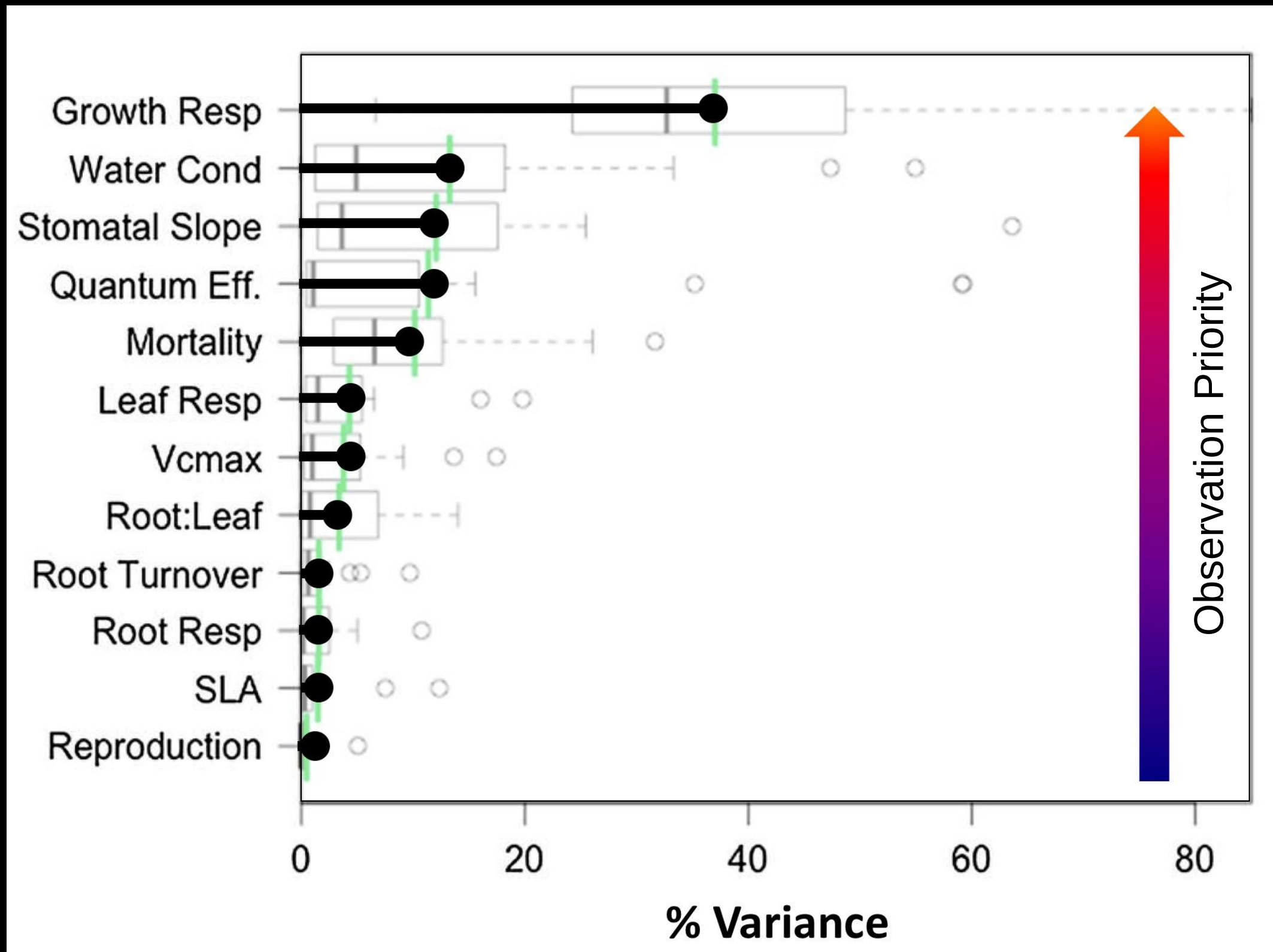
VARIANCE DECOMPOSITION

— Prior
— Posterior

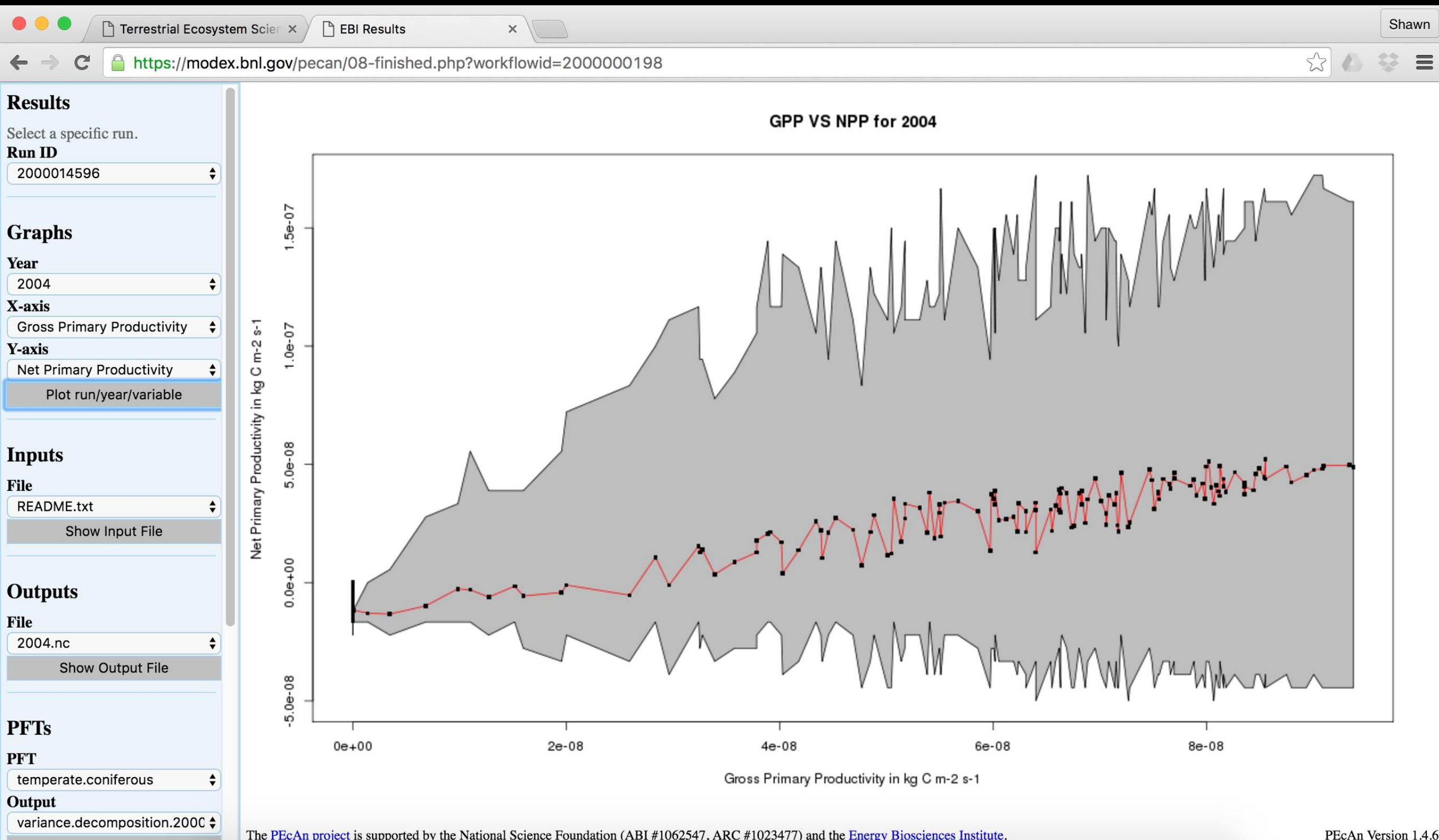


*can easily be extended to driver and IC uncertainties

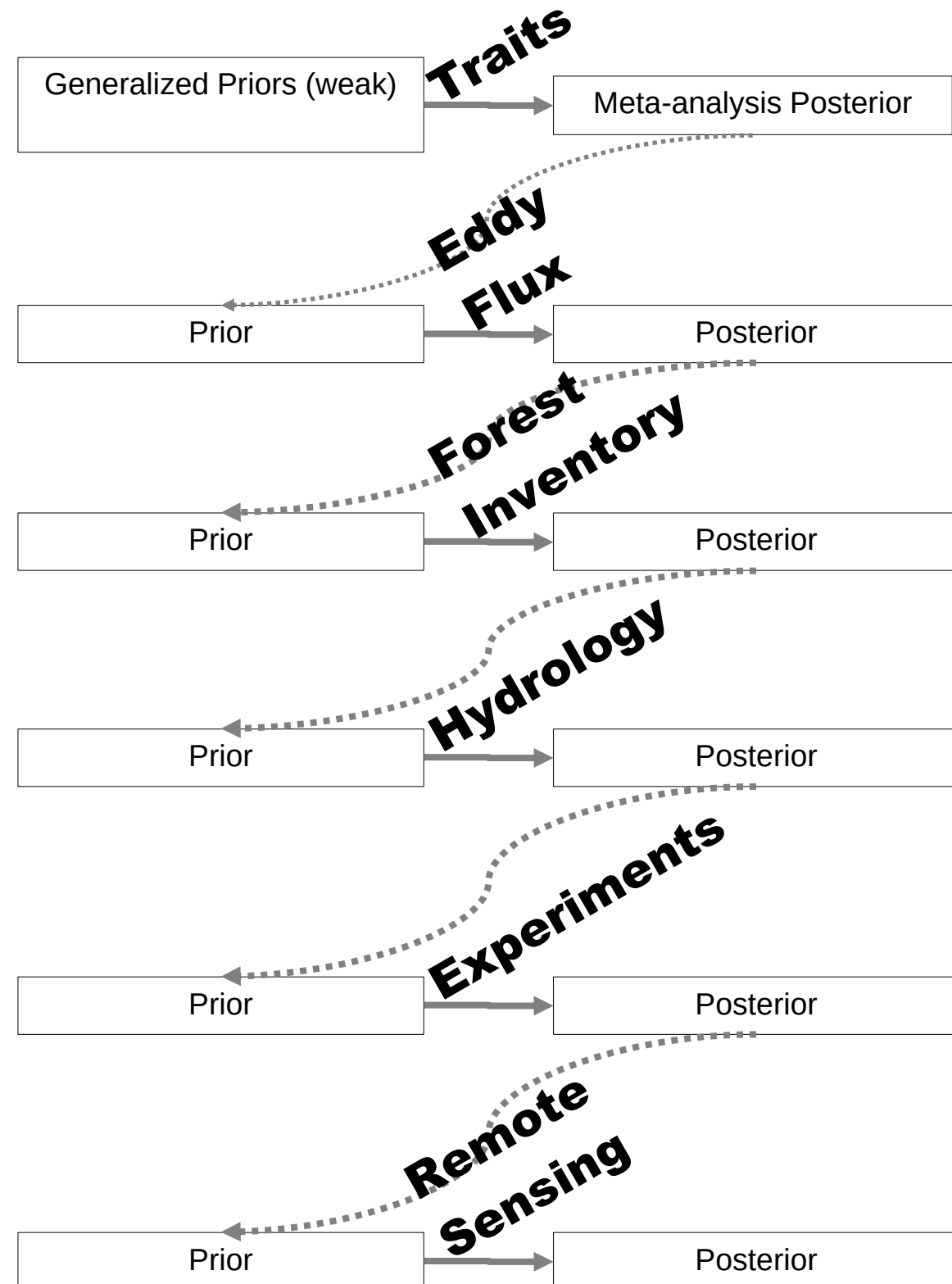
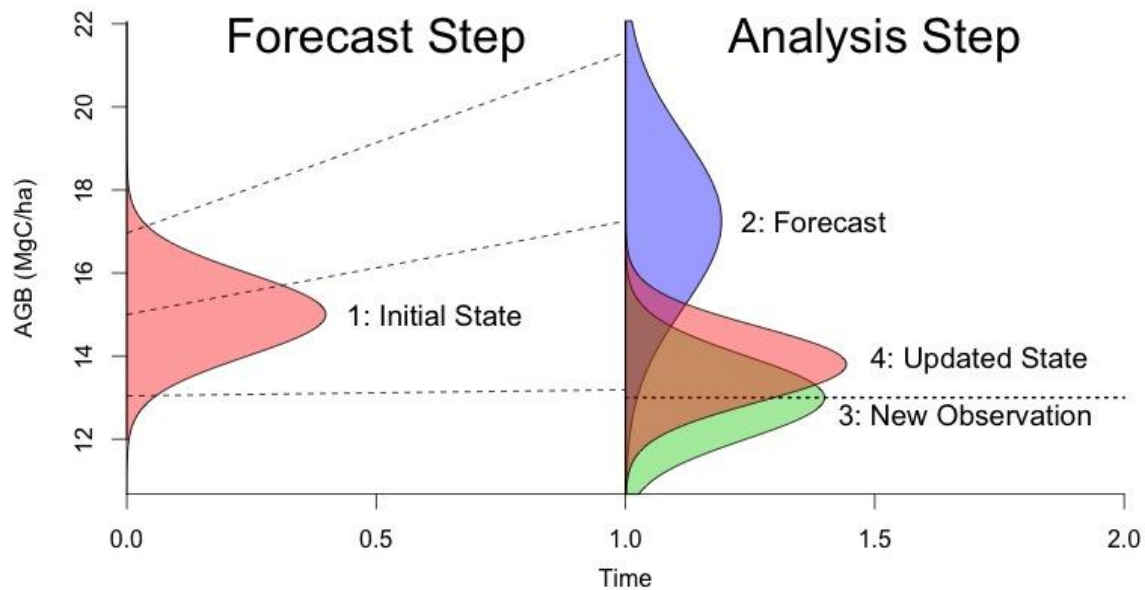
NORTH AMERICA: MULTI-SITE VARIANCE DECOMPOSITION



INTERACTIVE VISUALIZATION



BAYESIAN DATA ASSIMILATION



Advanced Edit

Select a file to edit.

File Selection

pecan.xml

Start Over

Continue

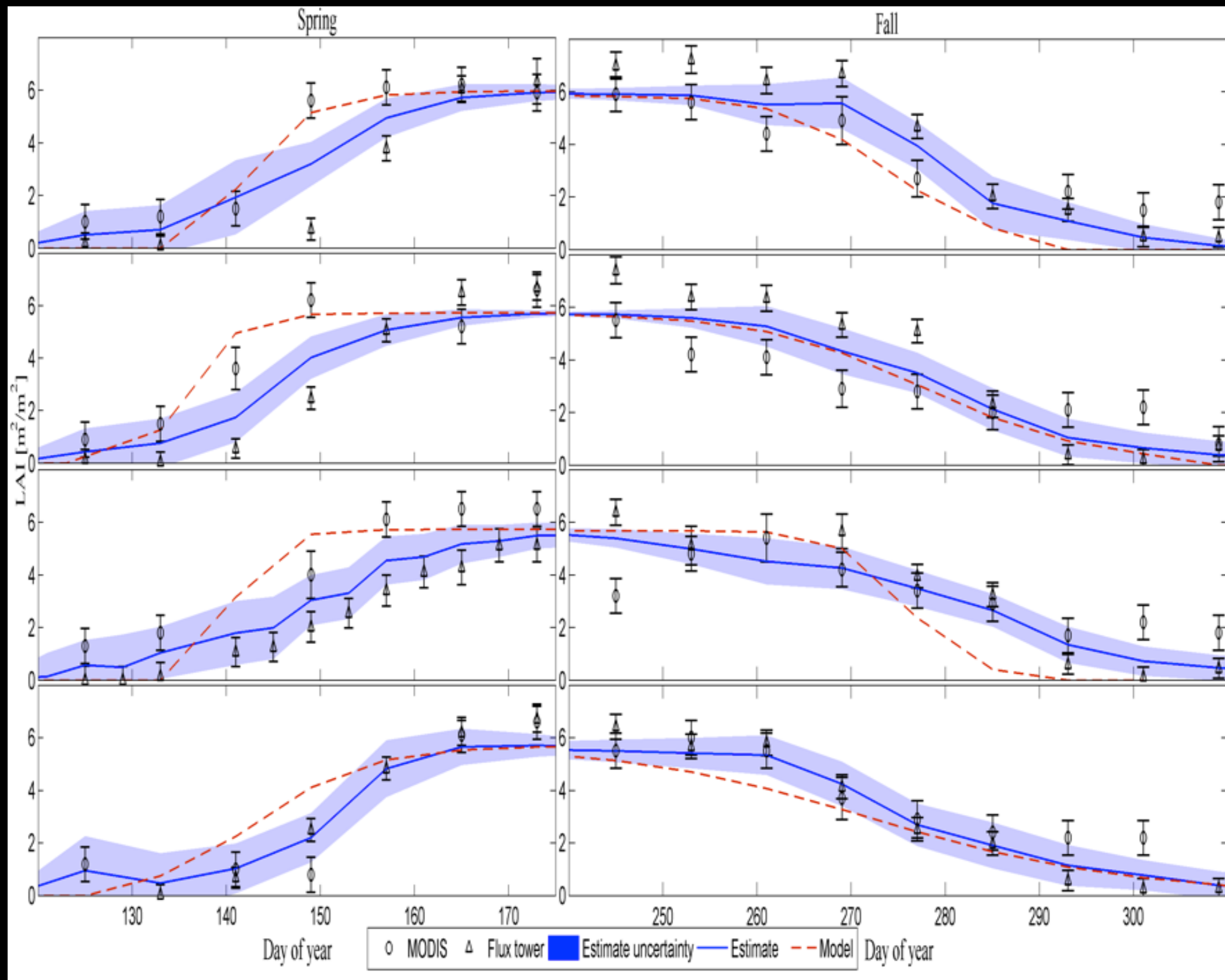
Data Assimilation

```
<?xml version="1.0"?>
<pecan>
  <assim.batch>
    <method>bruteforce</method>
    <iter>2500</iter>
    <diag.plot.iter>25</diag.plot.iter>
    <param.names>
      <param>YOUR_PARAM_1</param>
      <param>YOUR_PARAM_2</param>
      <param>YOUR_PARAM_3</param>
    </param.names>
    <jump>
      <adapt>25</adapt>
      <adj.min>0.1</adj.min>
      <ar.target>0.5</ar.target>
    </jump>
    <inputs>
      <file>
        <path>~/output/dbfiles/Ameriflux_site_0-772/US-NR1.2006.nc</path>
        <format>Ameriflux.L2</format>
        <data.model>
          <likelihood>Laplace</likelihood>
          <variable.id>297</variable.id>
        </data.model>
      </file>
    </inputs>
  </assim.batch>
  <outdir>/home/kooper/output//PEcAn_990000000006</outdir>
  <database>
    <bety>
      <user>bety</user>
      <password>bety</password>
      <host>localhost</host>
      <dbname>bety</dbname>
    </bety>
  </database>
</pecan>
```

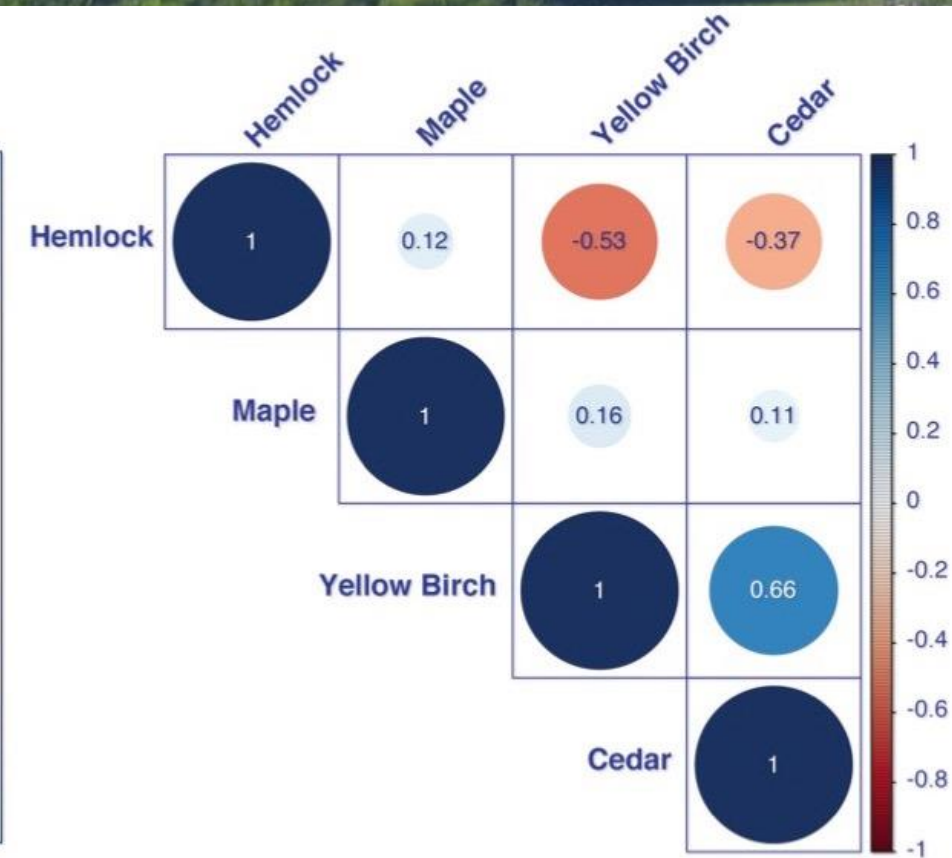
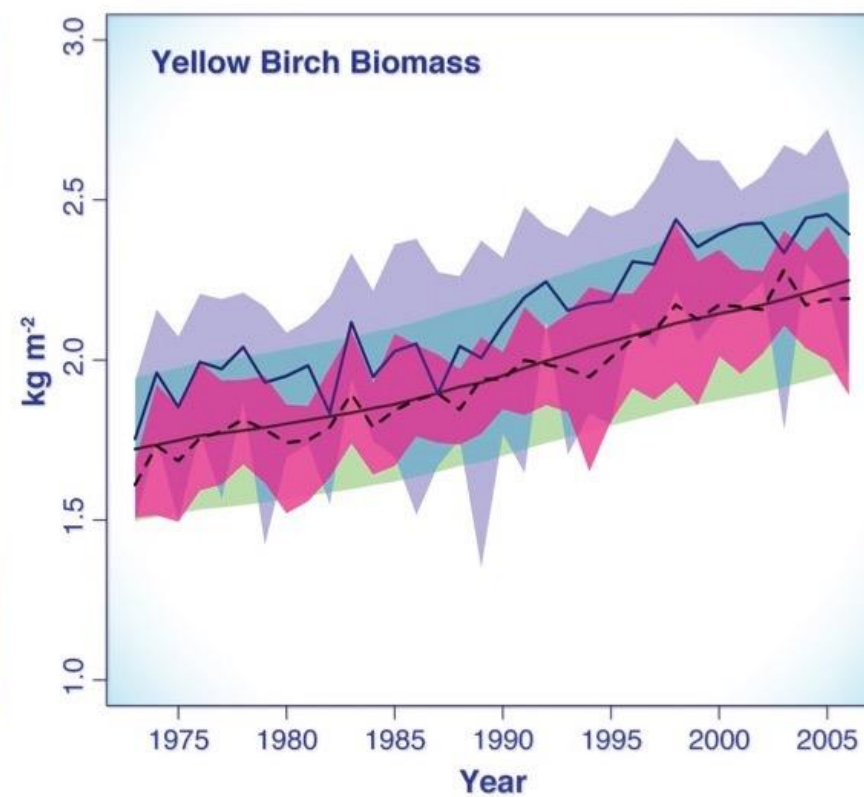
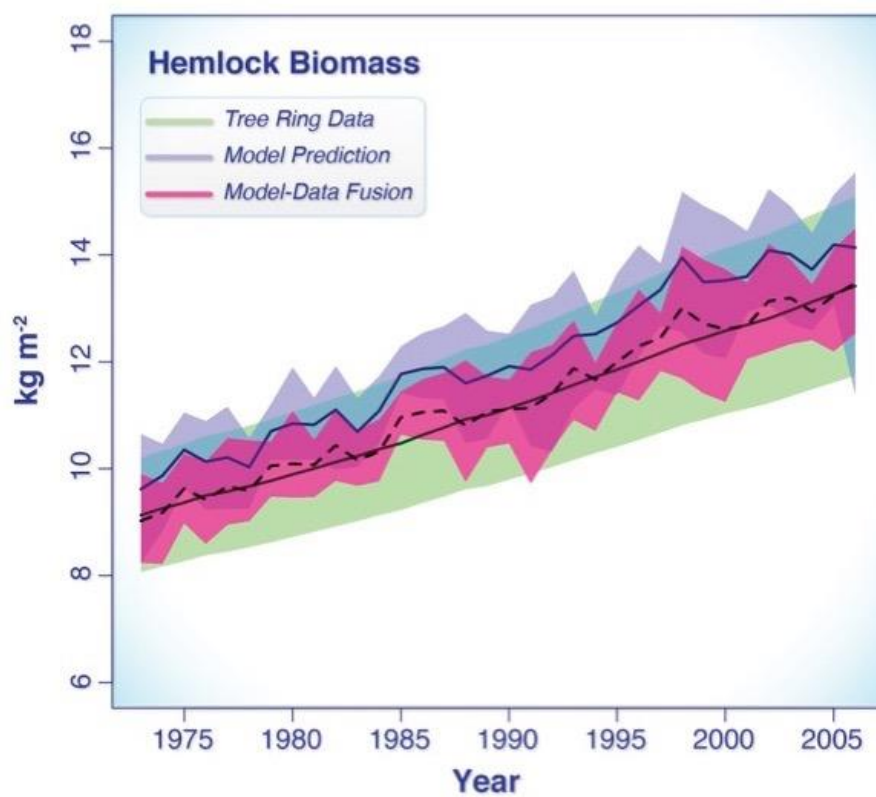
Method: MCMC, block
MCMC, emulated
MCMC, EnKF, SMC

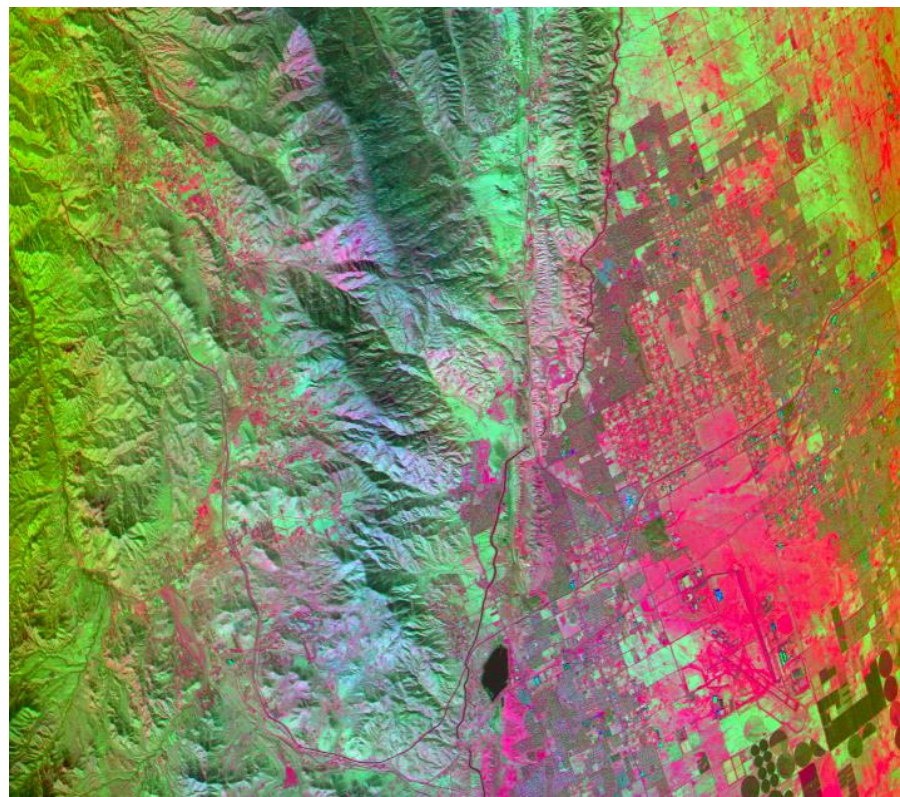
Save

LAI ASSIMILATION: WILLOW CREEK, WI



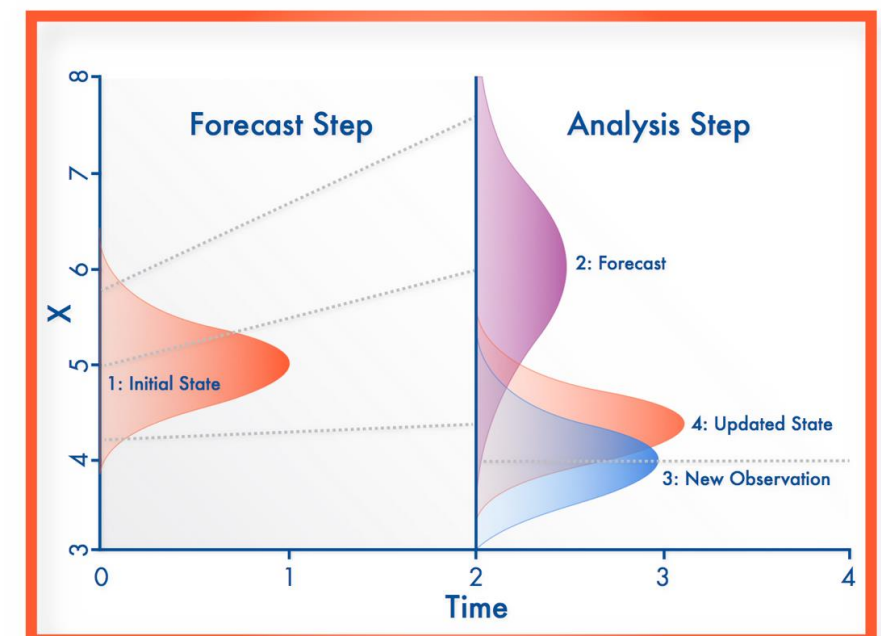
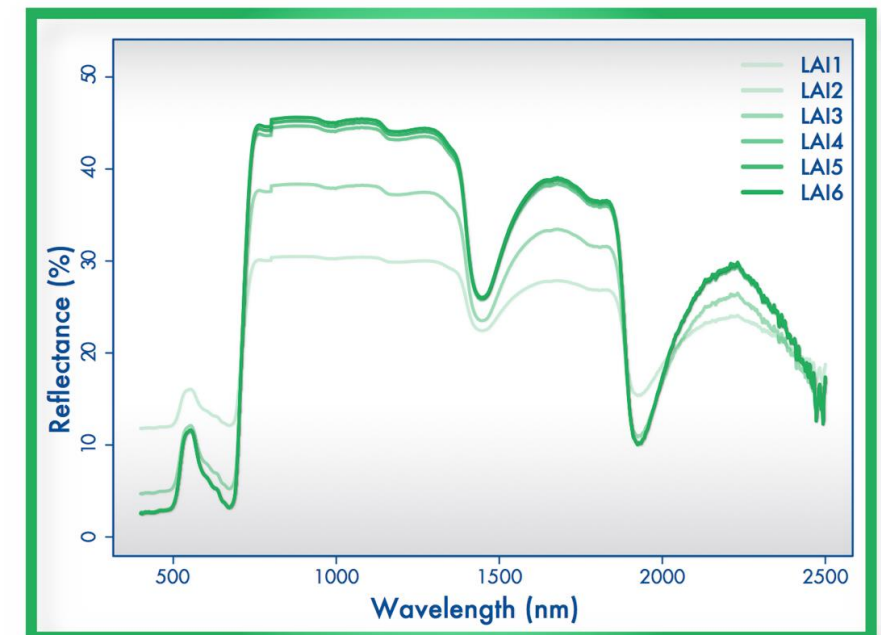
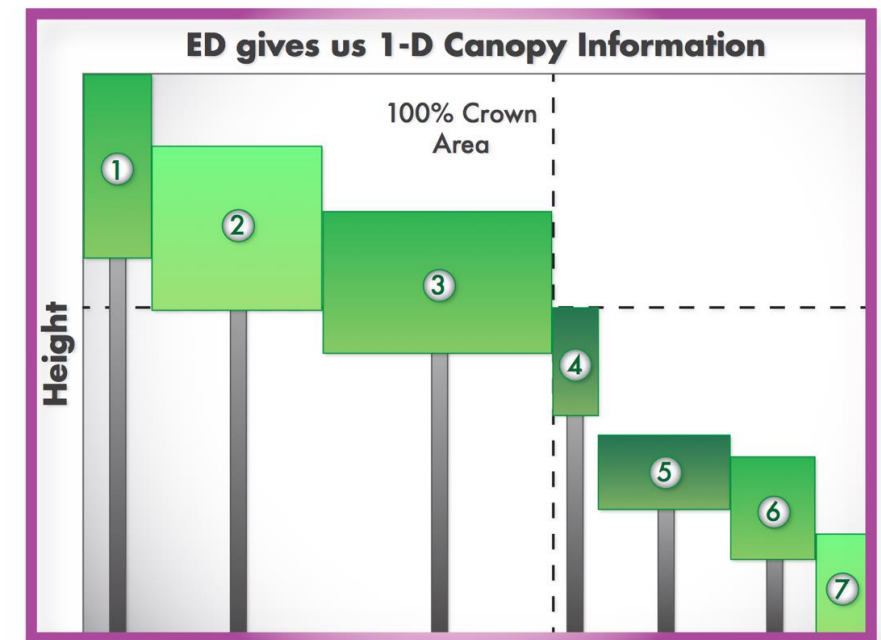
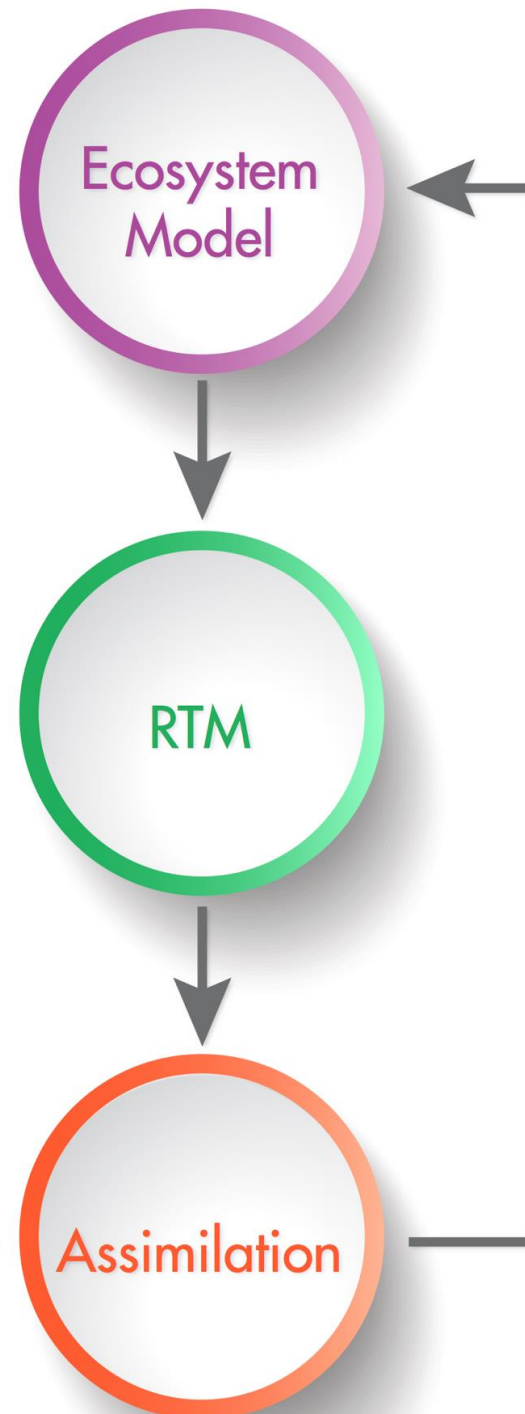
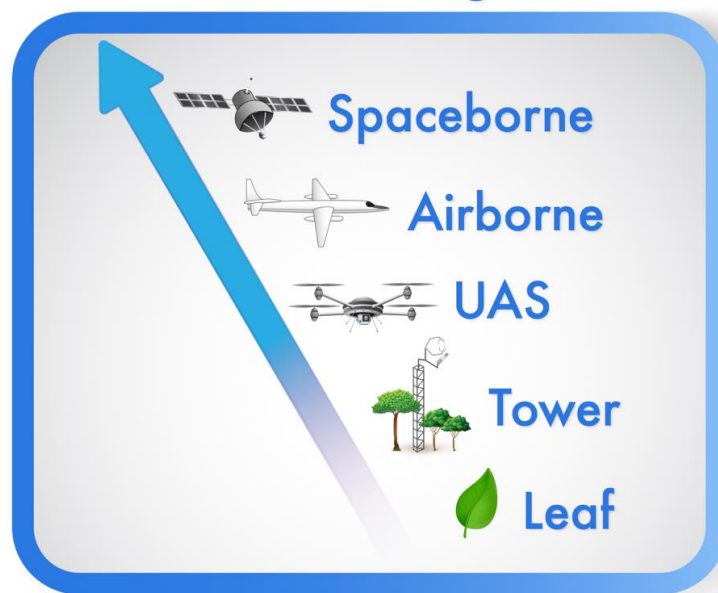
Raiho & Dietze *unpublished*





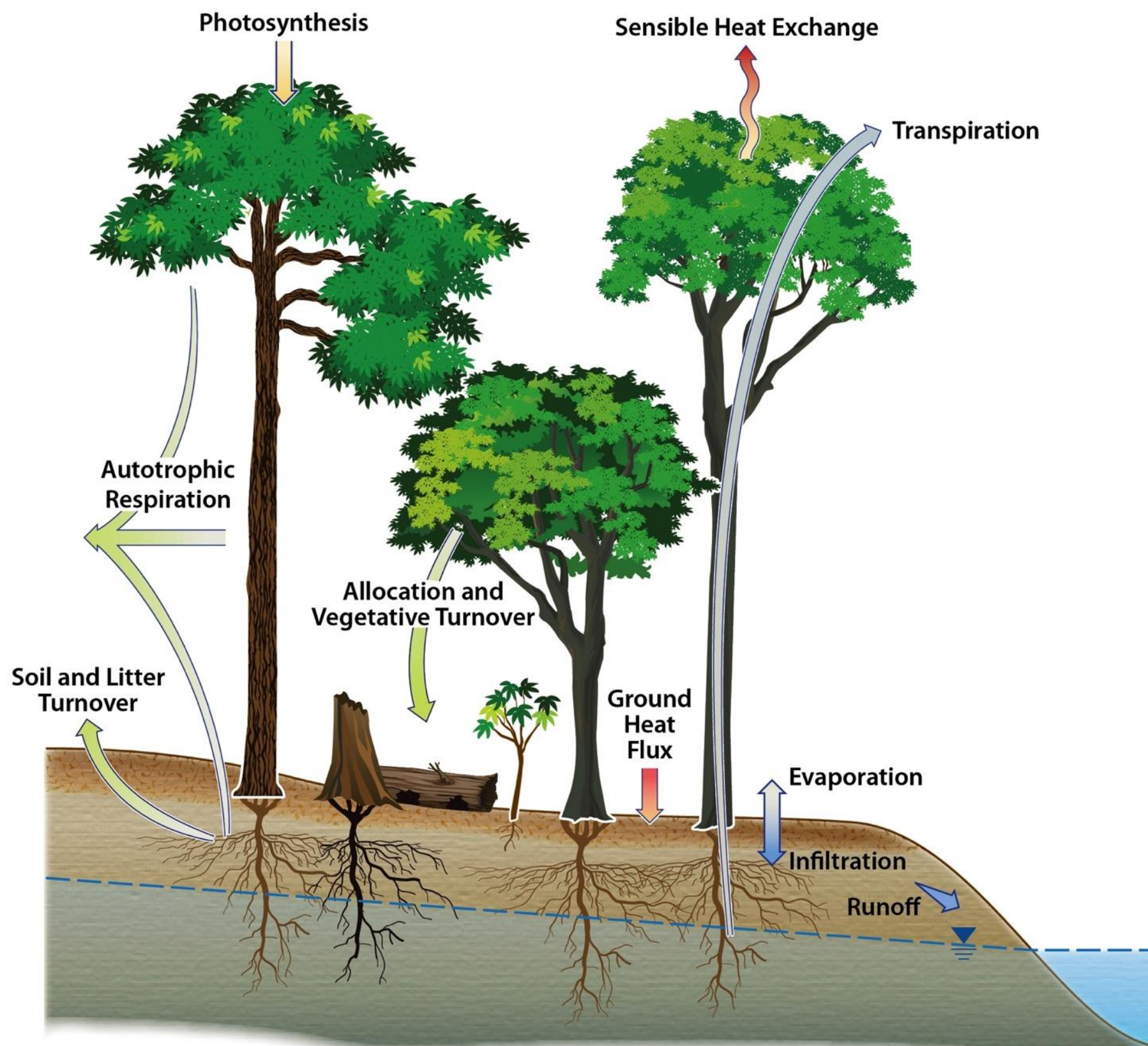
HyspIRI Airborne Campaign

Remote Sensing Data





NGEE - Tropics

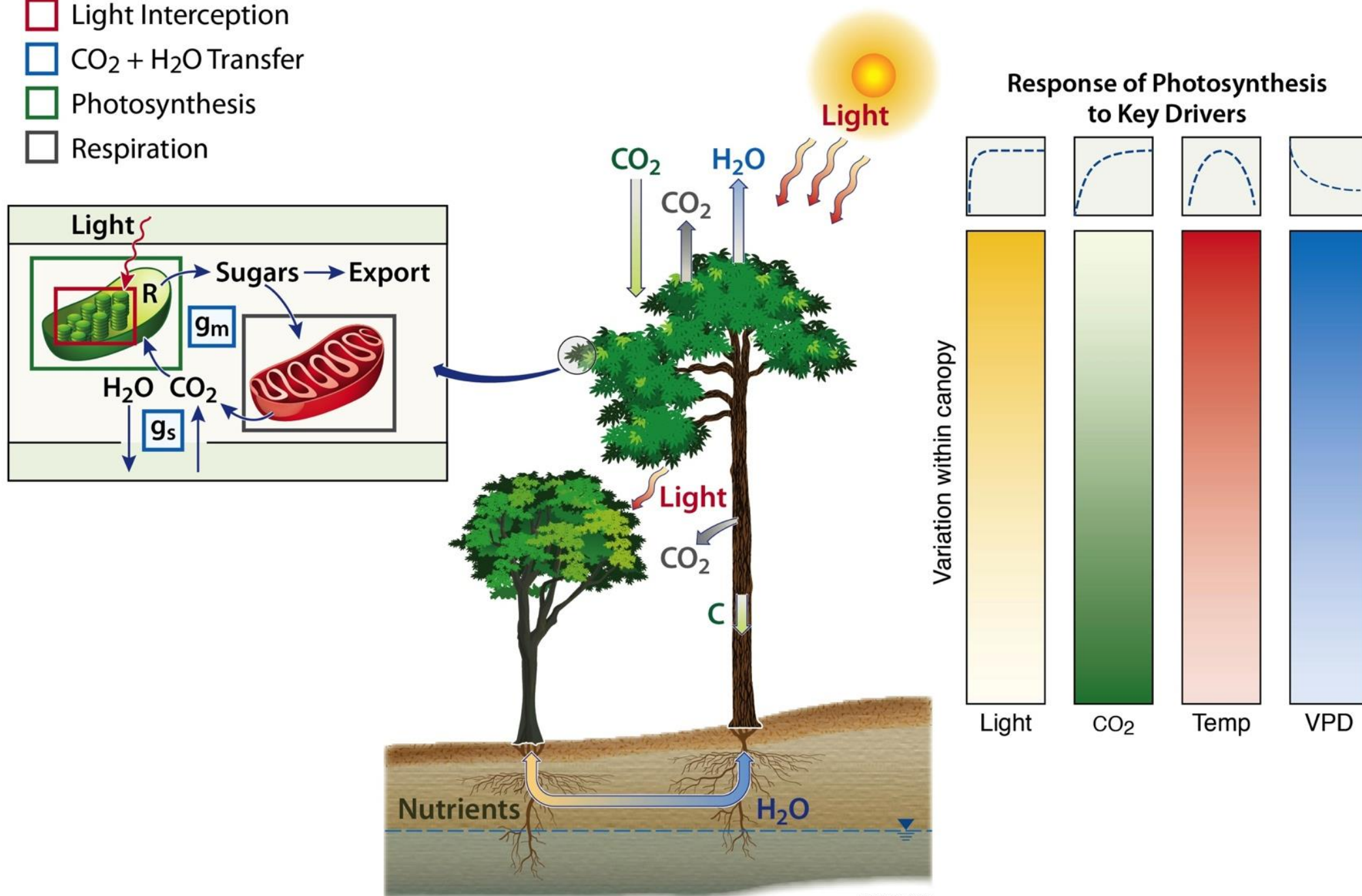




Carbon Uptake & Allocation

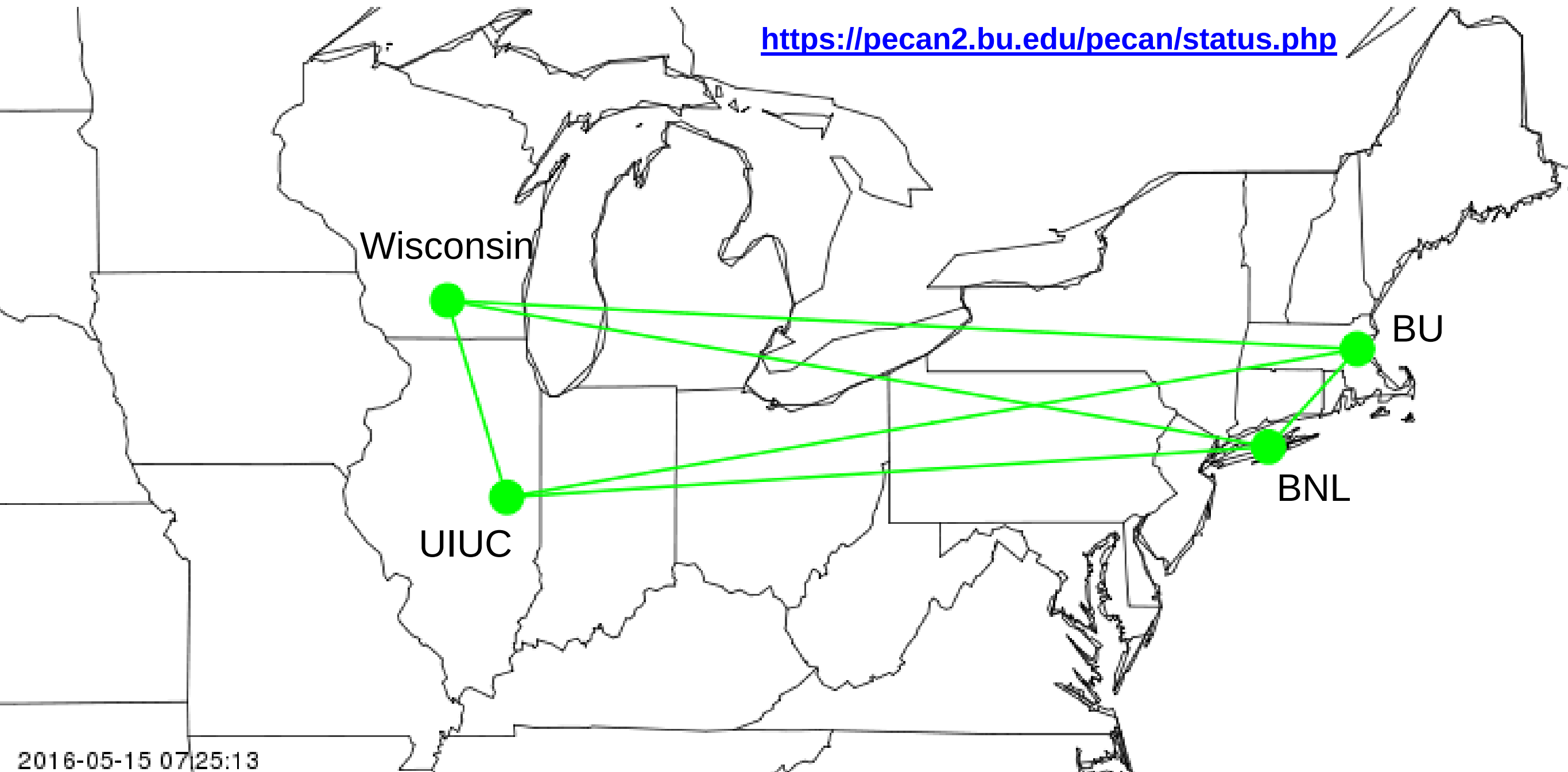
Key Processes

- Light Interception
- $\text{CO}_2 + \text{H}_2\text{O}$ Transfer
- Photosynthesis
- Respiration



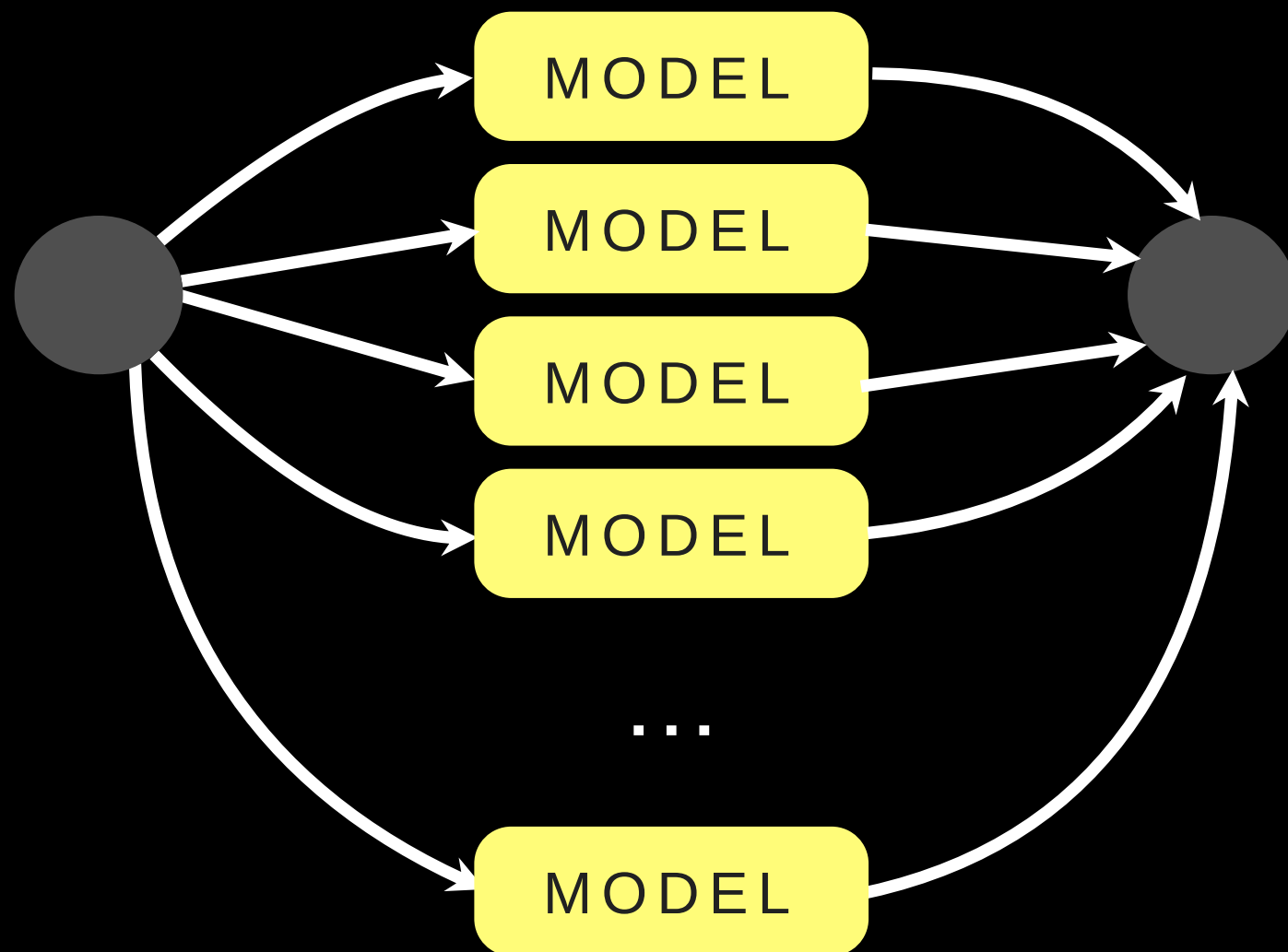
PECAN 2.0

Building a collaborative network



PECAN 2.0

Enabling multi-model synthesis & forecast



Live:

ED2, SIPNET, DALEC,
LINKAGES, BIOGRO, PRELES

In progress:

CLM, FATE, MAESPA, G'DAY,
LPJ-GUESS, MAAT

On deck:

LPJwsl, LANDIS, JULES,
ACONITE, SIB, SIBCASA,
TEM, DAYCENT, LM3, LM3-
PPA, ... *many many more*

CONCLUSIONS

- Data synthesis:
Informatics tools to tackle volume, diversity
- Common API, standards, and web 2.0 sharing to help make modeling scalable
- Web-based tools to help make models accessible
- Bayesian analysis tools for tackling challenges of data-model synthesis (*data assimilation*) & assessing uncertainties (*variance decomposition*)
- Evolving model evaluation and benchmarking tools to enable model improvements

<http://pecanproject.org>

<https://github.com/PecanProject>

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AND DAN WANG

NSF 1062547, 1062204, 1241894, 1261582, 1318164, 1346748,
1458021, NASA 13-TE13-0060, Amazon AWS Education Grant