



NCAR
OPERATED BY UCAR

SEPTEMBER 15, 2025

Land Modeling II

Biogeochemistry & Ecosystems

Adrianna Foster

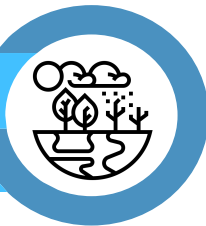
Scientist V, NCAR CGD Terrestrial Sciences Section

This material is based upon work supported by the NSF National Center for Atmospheric Research, a major facility sponsored by the U.S. National Science Foundation and managed by the University Corporation for Atmospheric Research. Any opinions, findings and conclusions or recommendations expressed in this material do not necessarily reflect the views of NSF.

Land biogeochemistry in CESM



Why?



How?



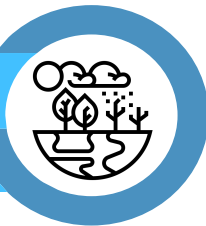
Future directions



Land biogeochemistry in CESM



Why?



How do ecosystems change when climate changes?



Climate-ecosystem question



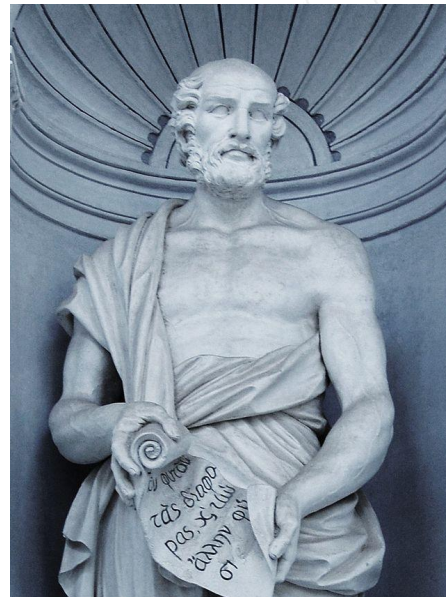
Enquiry into Plants, c. 350 BC

Transplanted species outside natural range

Changes in phenology with climate

Relationship between altitude/latitude and climate/vegetation

Theophrastus
Palermo Botanical Garden



Climate-ecosystem question

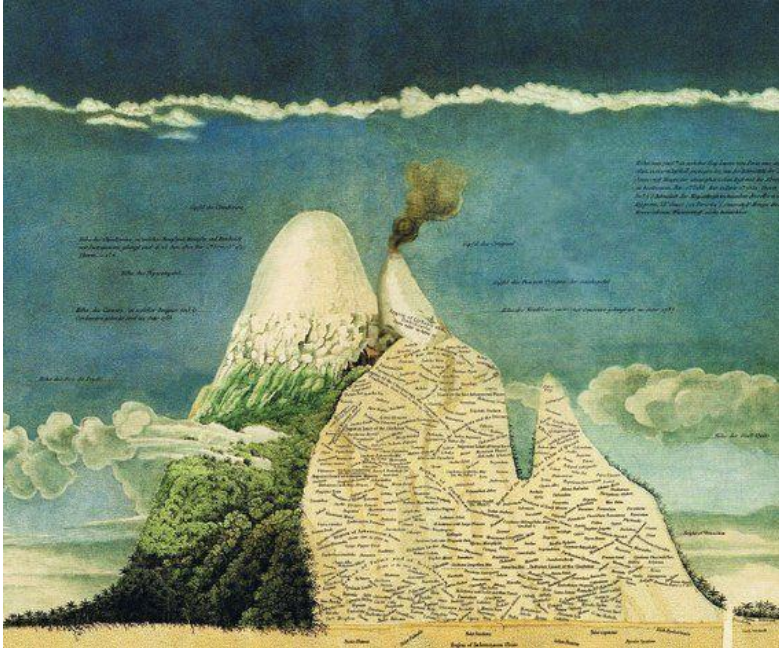
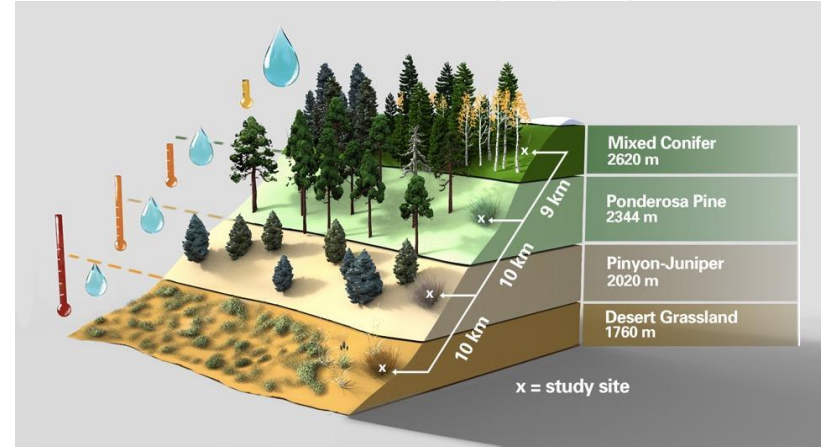
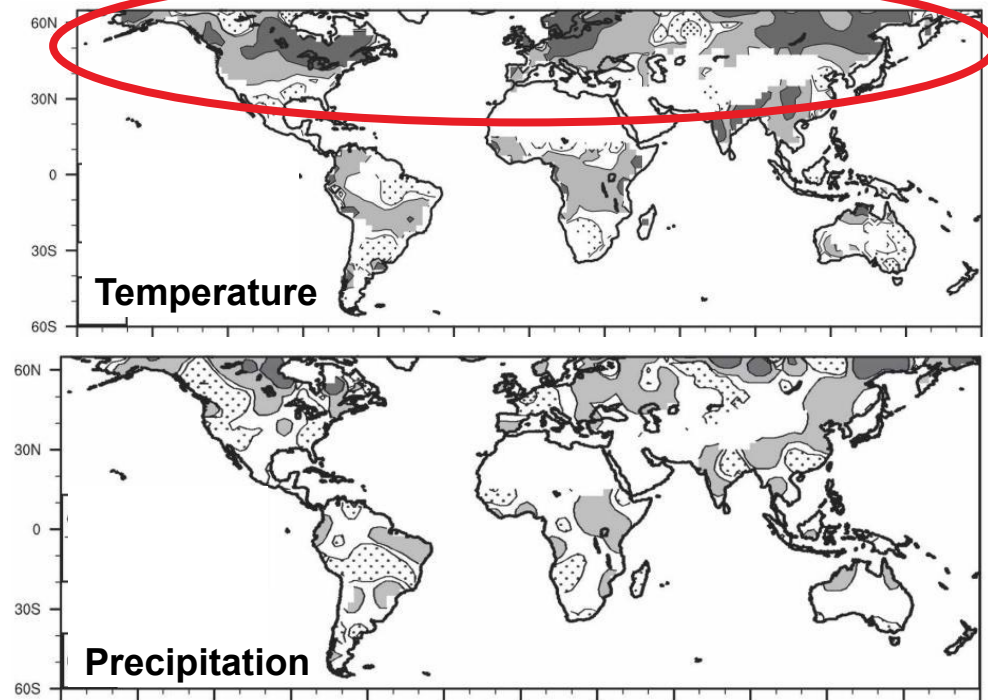


Tableau des Régions équinoxiales from Humboldt (1807)



Morrissey et al. (2019) *Nature Ecology and Evolution*

Vegetation impacts climate



Short time scales –
dominated by albedo and
evapotranspiration

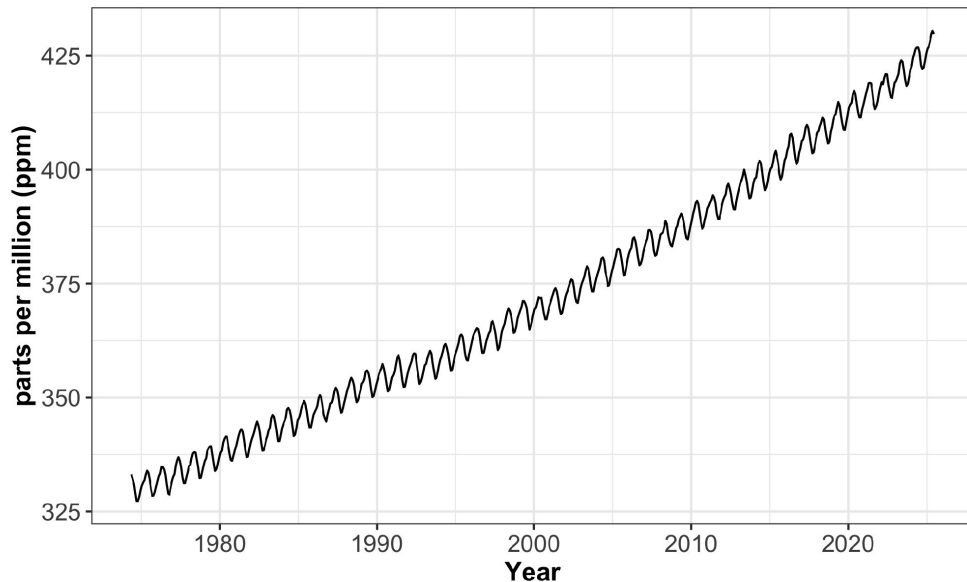
Liu et al. 2006 *Journal of Climate*

Vegetation impacts climate



Atmospheric CO₂ at Mauna Loa Observatory

Scripps Institute of Oceanography
NOAA Global Monitoring Laboratory



**Longer time scales –
fate of carbon**

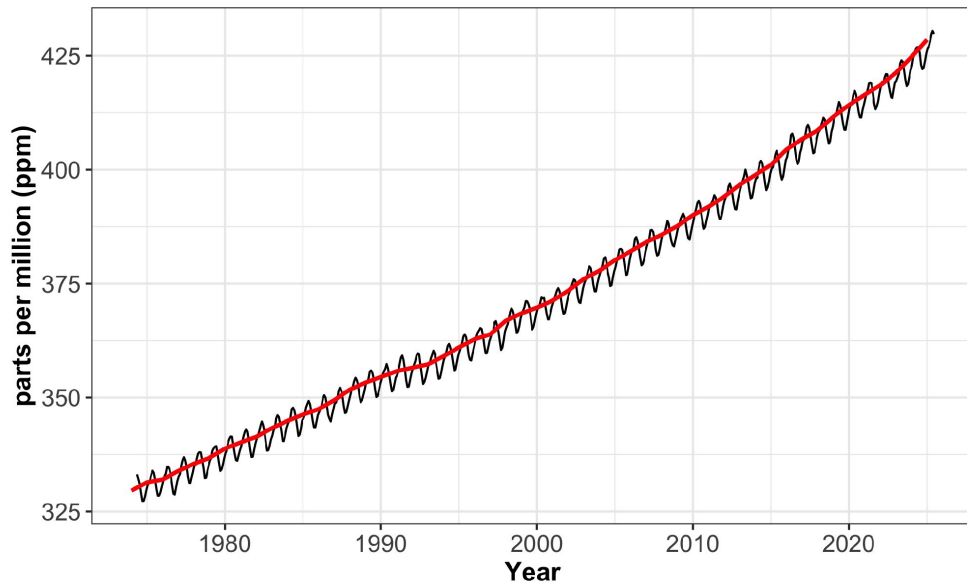
<https://gml.noaa.gov/ccgg/trends/mlo.html>

Vegetation impacts climate



Atmospheric CO₂ at Mauna Loa Observatory

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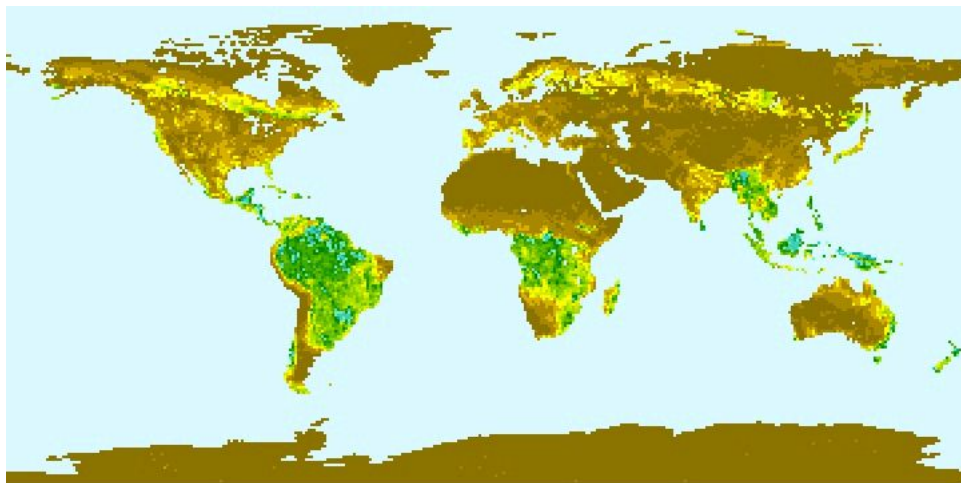
<https://gml.noaa.gov/ccgg/trends/mlo.html>

**Longer time scales –
fate of carbon**



**Upward trend
due to human
activities**

Vegetation impacts climate

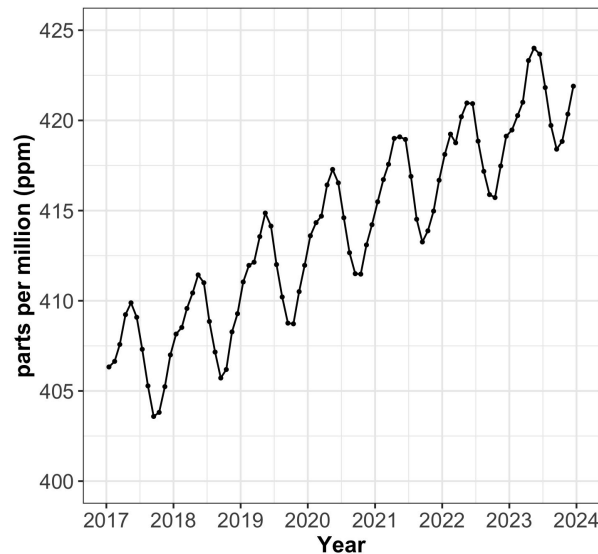


MODIS LAI

Vegetation “breathing”

Longer time scales – fate of carbon

Recent monthly mean CO₂ at Mauna Loa Observatory



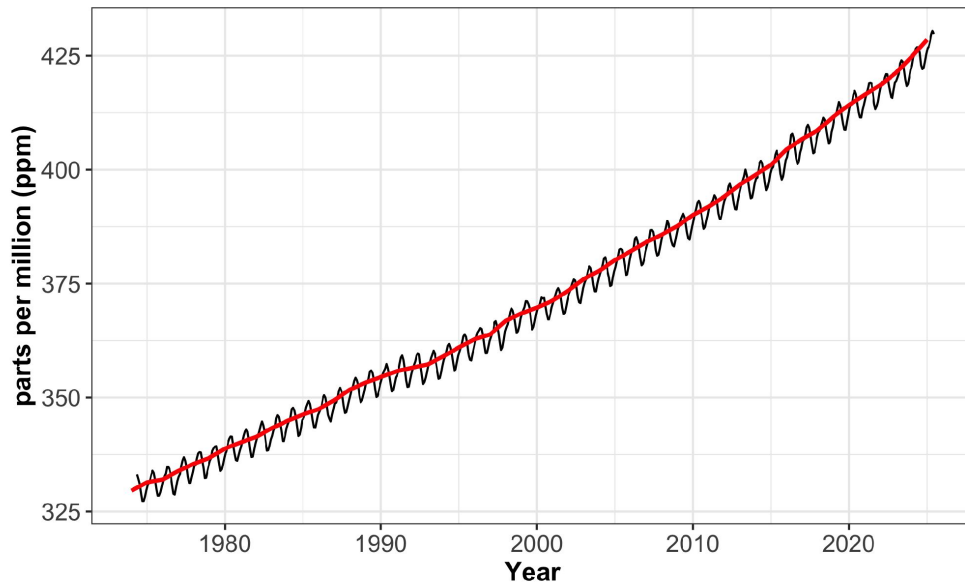
<https://gml.noaa.gov/ccgg/trends/mlo.html>

Vegetation impacts climate



Atmospheric CO₂ at Mauna Loa Observatory

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<https://gml.noaa.gov/ccgg/trends/mlo.html>

**Longer time scales –
fate of carbon**



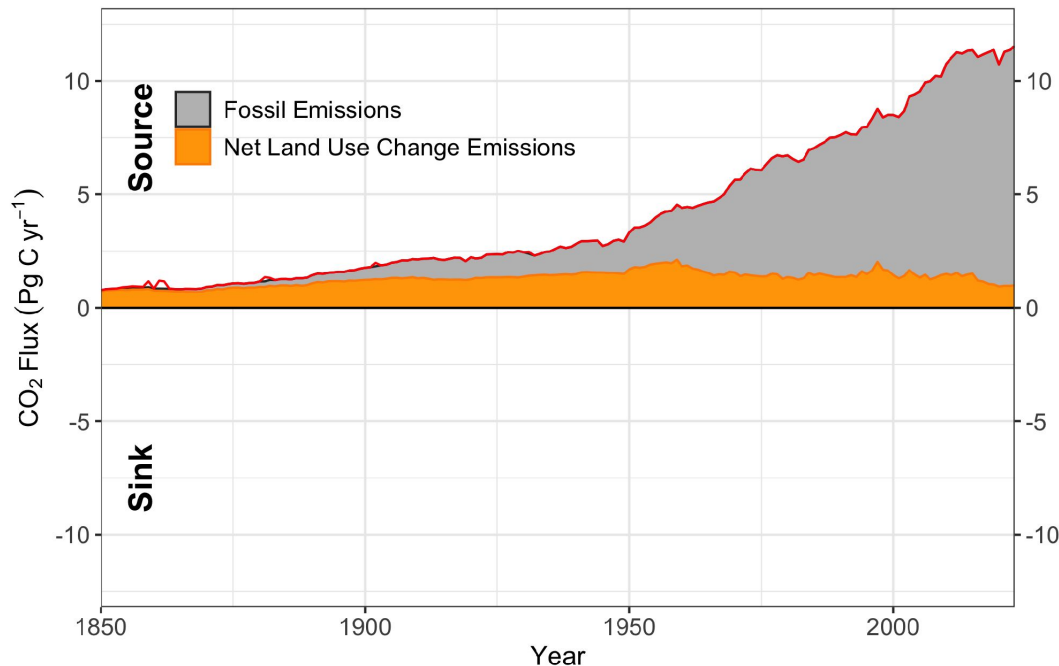
**Upward trend
due to human
activities**

Annual carbon emissions



Annual Carbon Emissions and their Partitioning

Friedlingstein et al. Global Carbon Budget 2024



Energy statistics and
cement production data

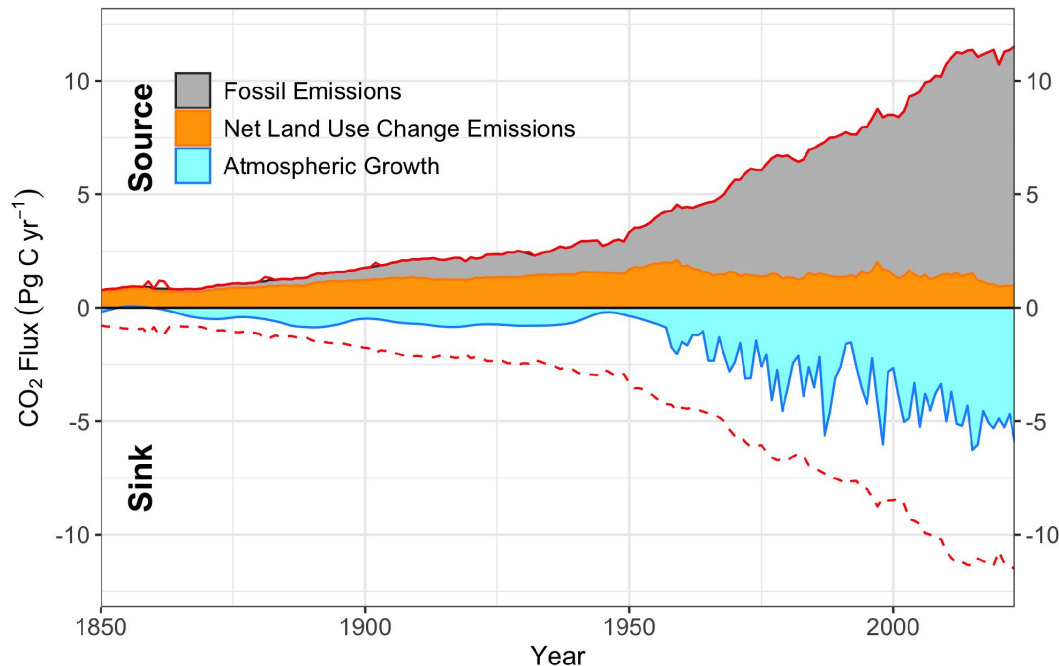
Land use and land use
change data

Annual carbon emissions



Annual Carbon Emissions and their Partitioning

Friedlingstein et al. Global Carbon Budget 2024



Energy statistics and
cement production data

Land use and land use
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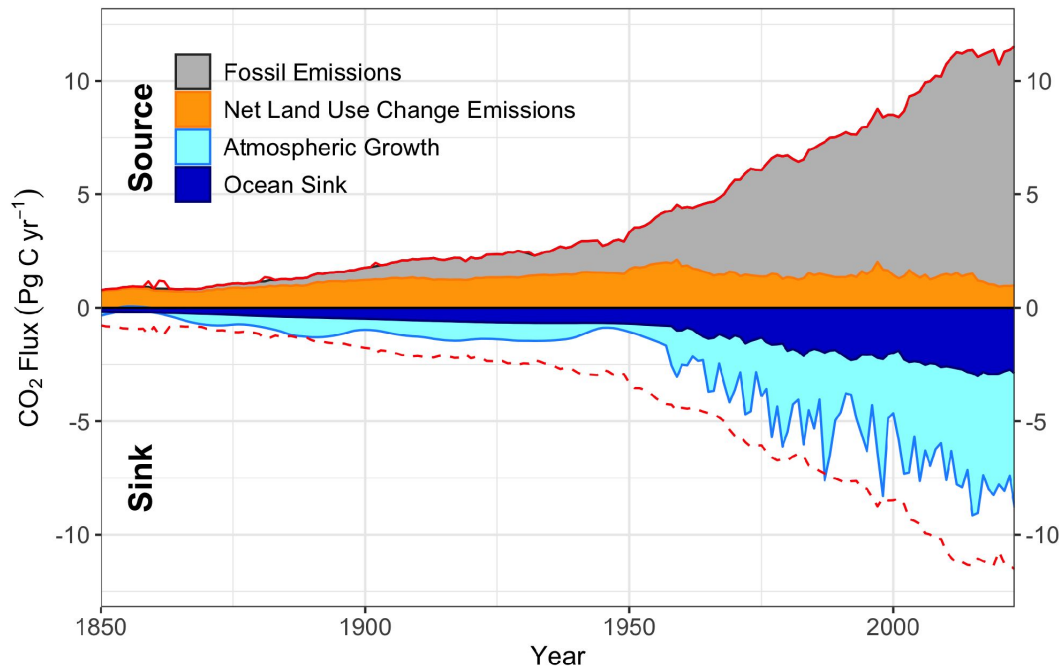
Atm. CO₂ observations

Annual carbon emissions



Annual Carbon Emissions and their Partitioning

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Energy statistics and
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Ocean biogeochemistry
models & data products

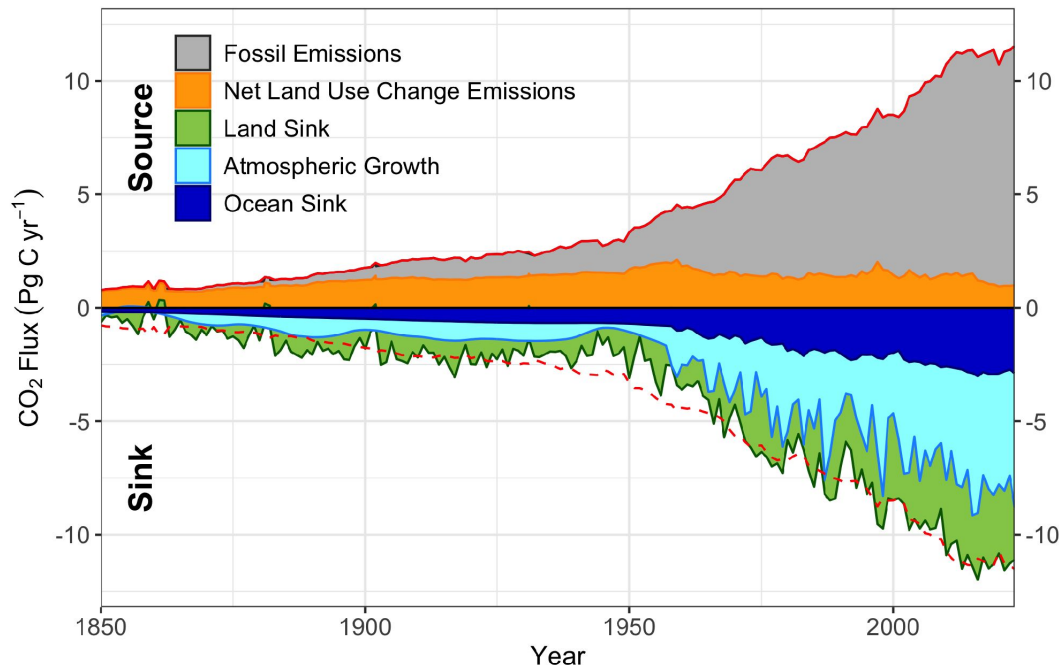
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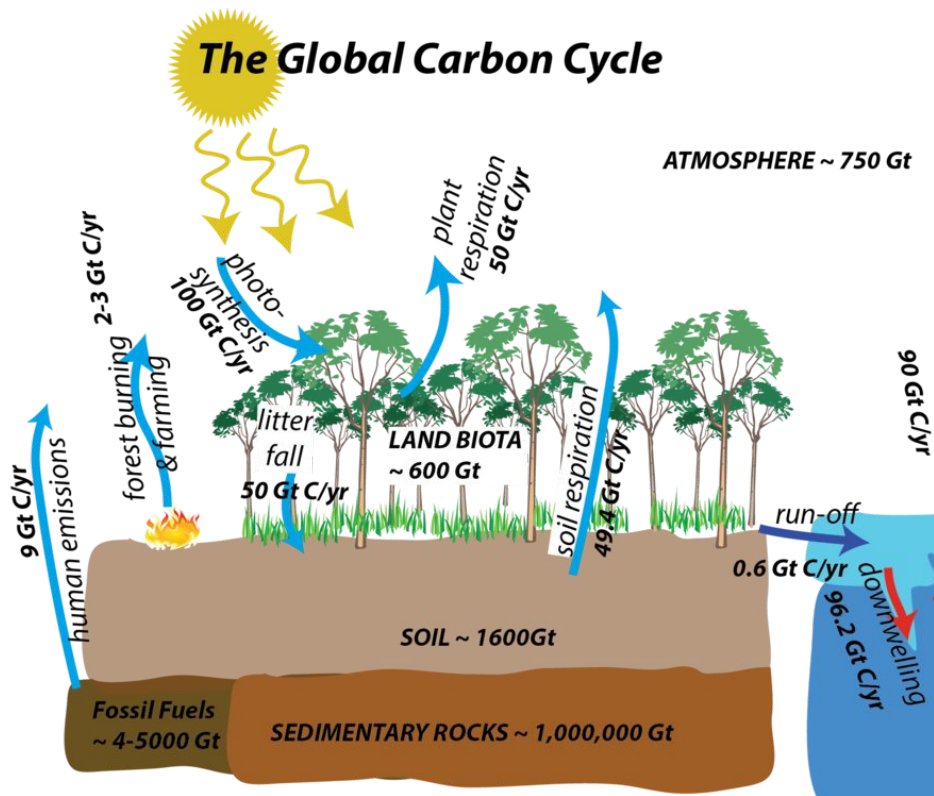
Atm. CO₂ observations

Global vegetation
models

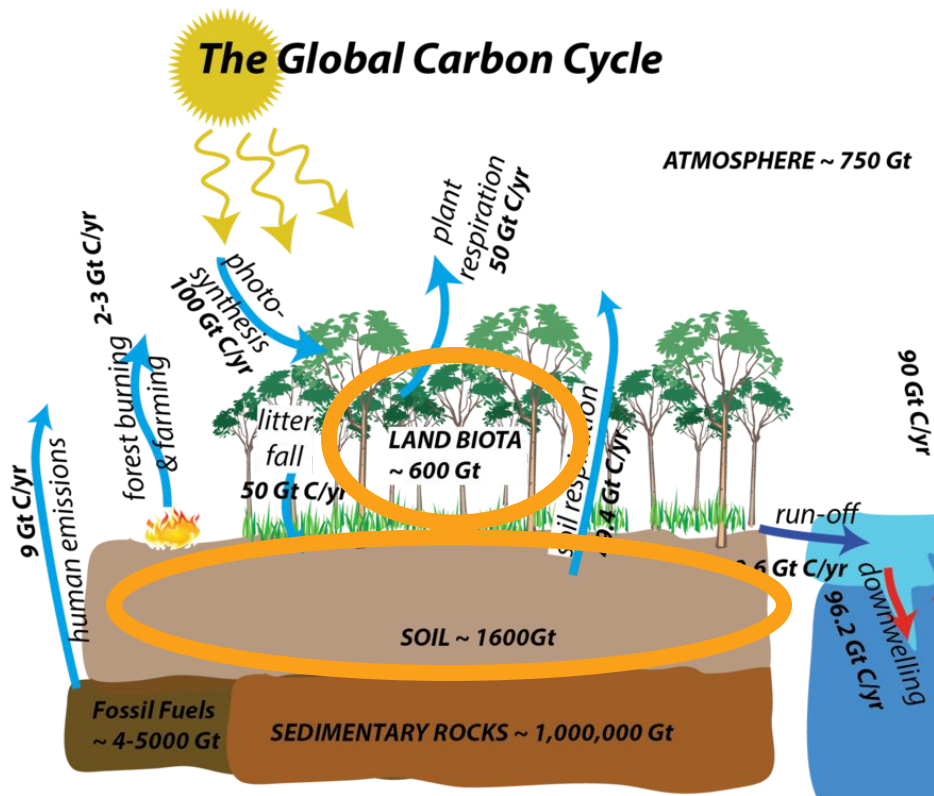
Global carbon cycle



The Global Carbon Cycle

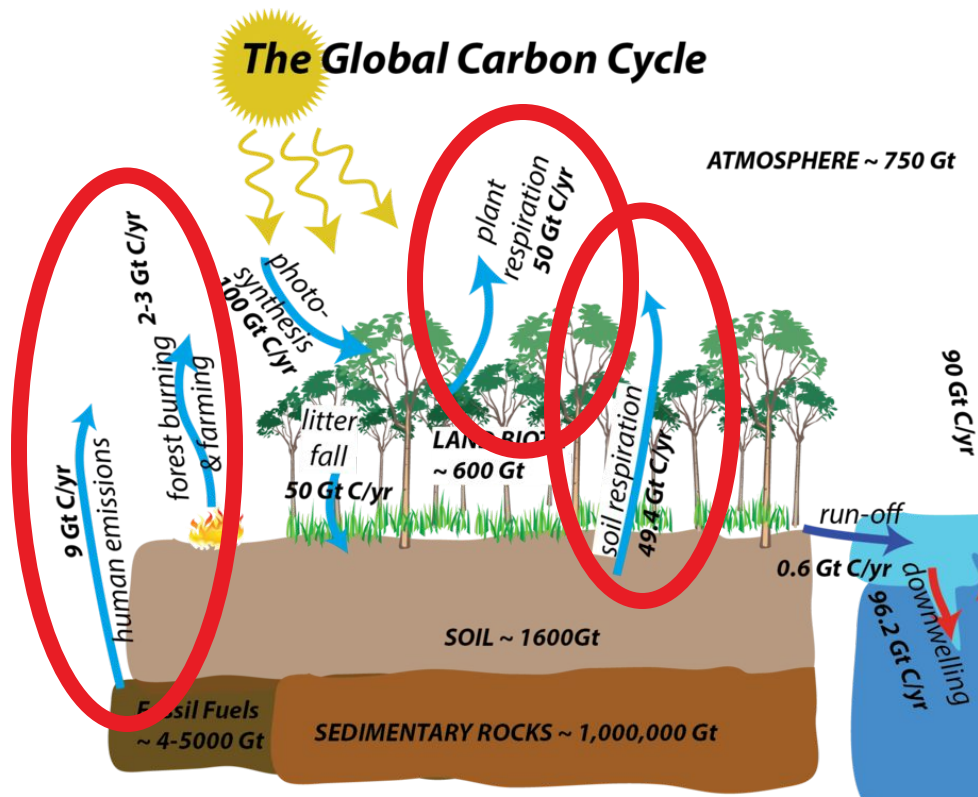


The Global Carbon Cycle

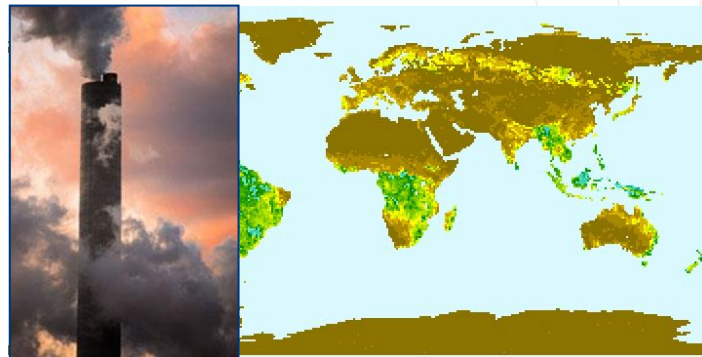


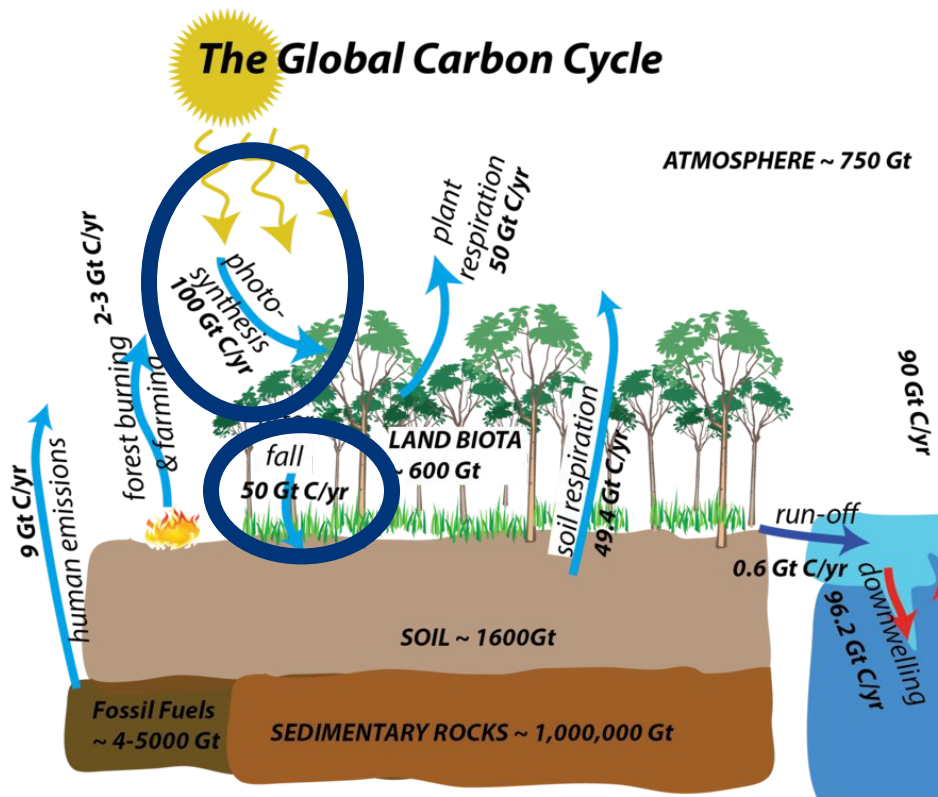
Huge pools

The Global Carbon Cycle

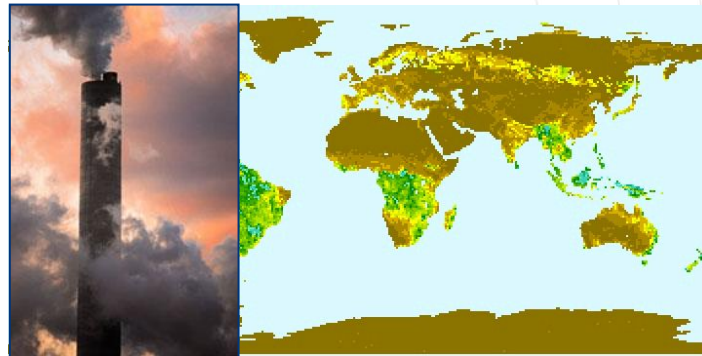


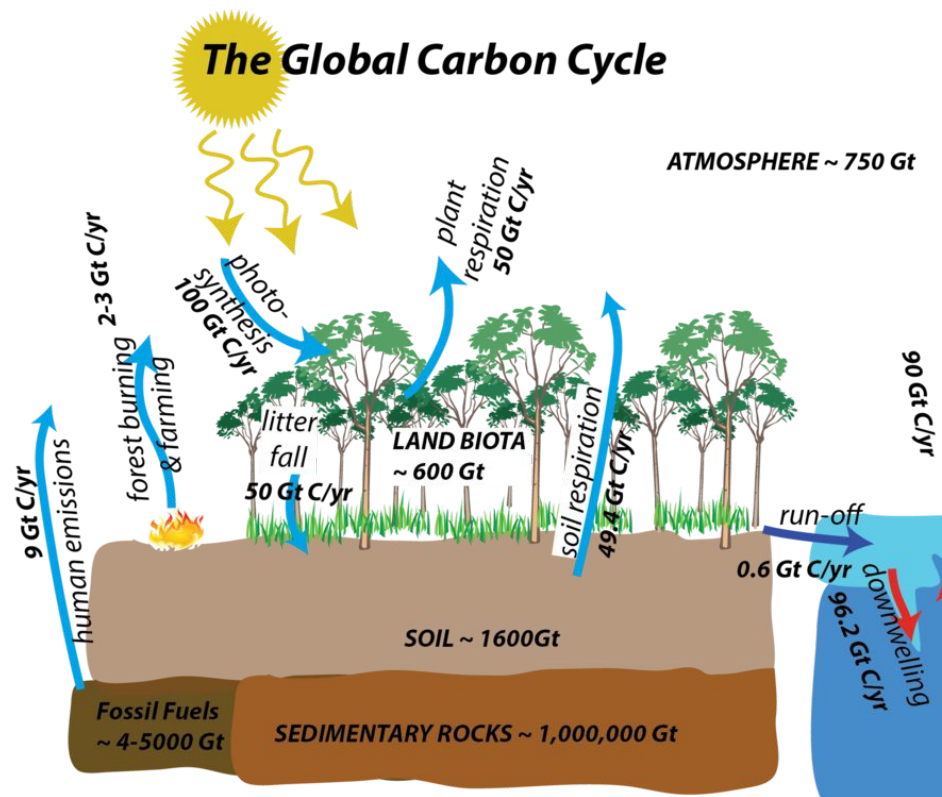
Huge pools
Large fluxes (out)





Huge pools
Large fluxes (out)
Large fluxes (in)





Huge pools
Large fluxes (out)
Large fluxes (in)
Sink = small residual

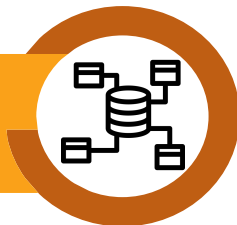
Land biogeochemistry in CESM

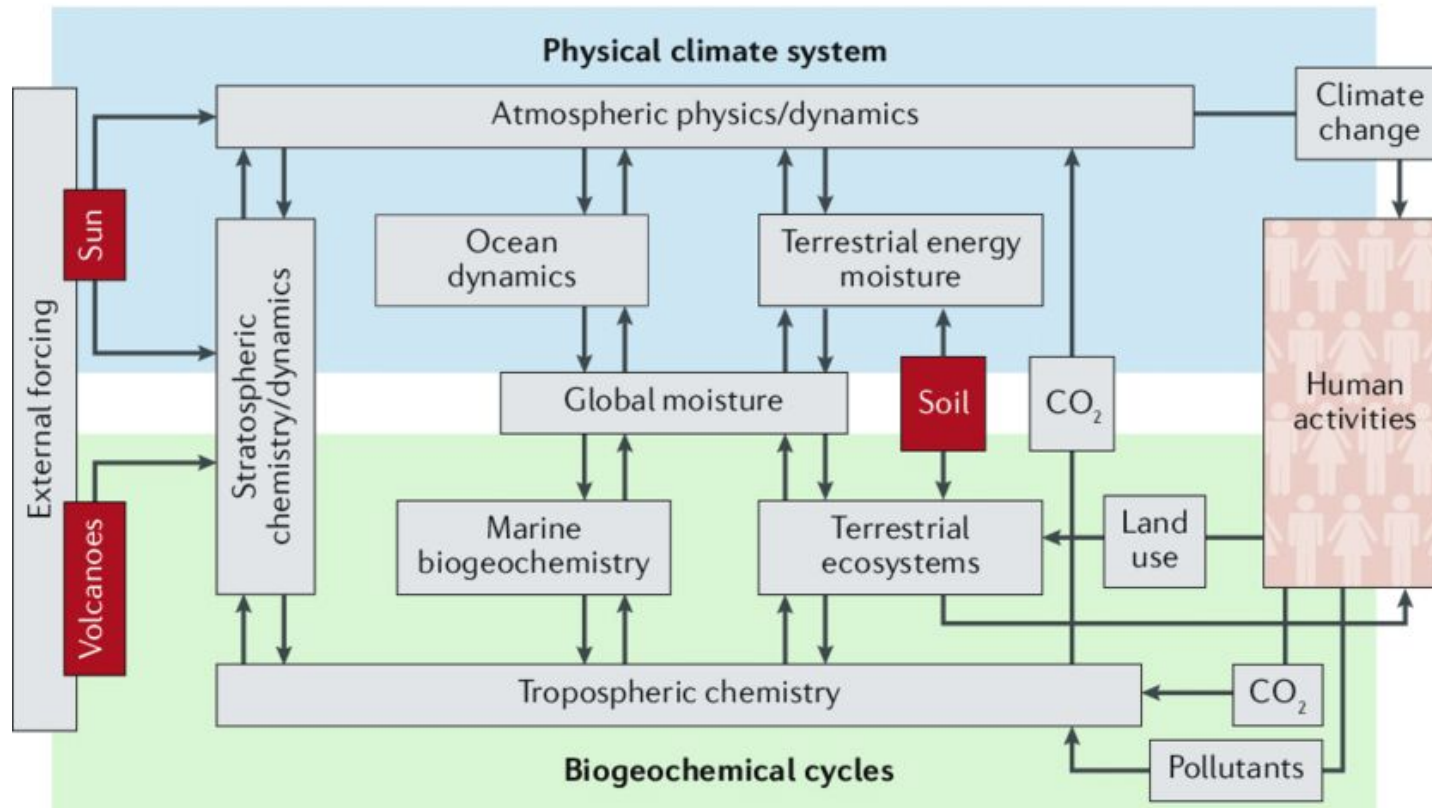


Why?



How?





“Bretherton diagram” showing the concept of an Earth System Model

Full-Form Earth System Models: Coupled Carbon-Climate Interaction Experiment (the “Flying Leap”)

by Inez Fung, Peter Rayner, and Pierre Friedlingstein; Edited by Dork Sahagian



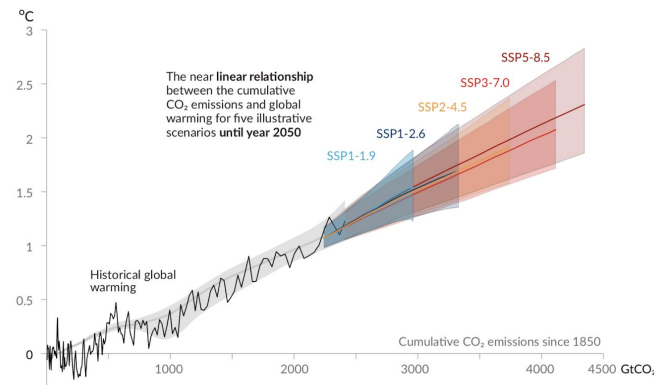
IGBP Newsletter, May 2000. The flying leap proposal was to make atmospheric CO₂ a prognostic variable in climate models

NCAR and CESM were key players in the development of the concept and creation of the first coupled carbon cycle models.

A. Swann, BGCWG

Every tonne of CO₂ emissions adds to global warming

Global surface temperature increase since 1850-1900 (°C) as a function of cumulative CO₂ emissions (GtCO₂)



Full-Form Earth System Models: Coupled Carbon-Climate Interaction Experiment (the “Flying Leap”)

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+ Coupled C-N biogeochemistry - CESM1



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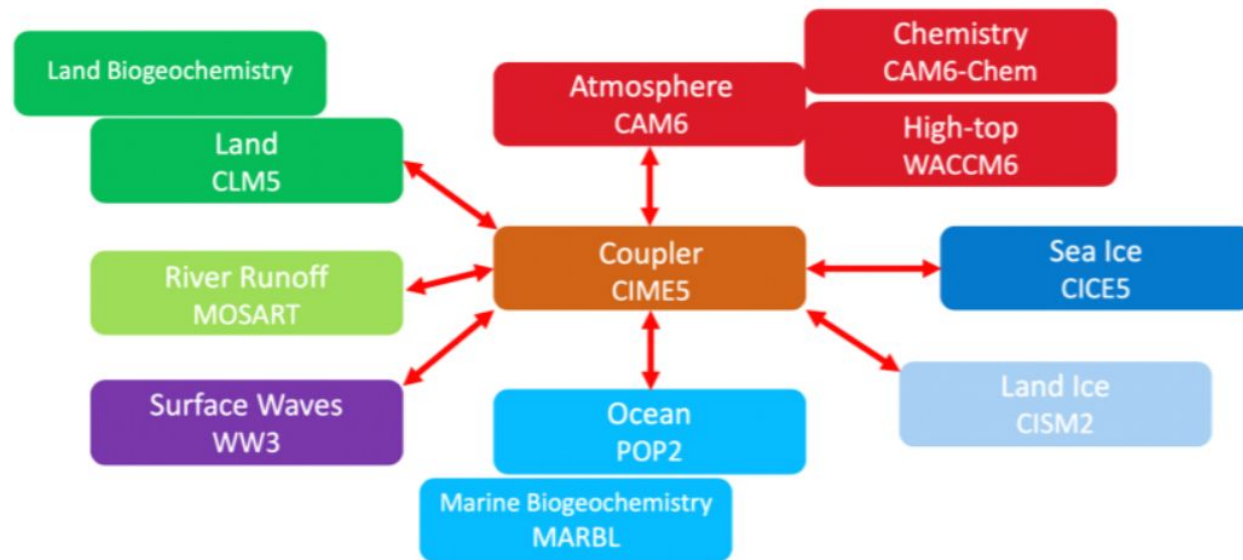
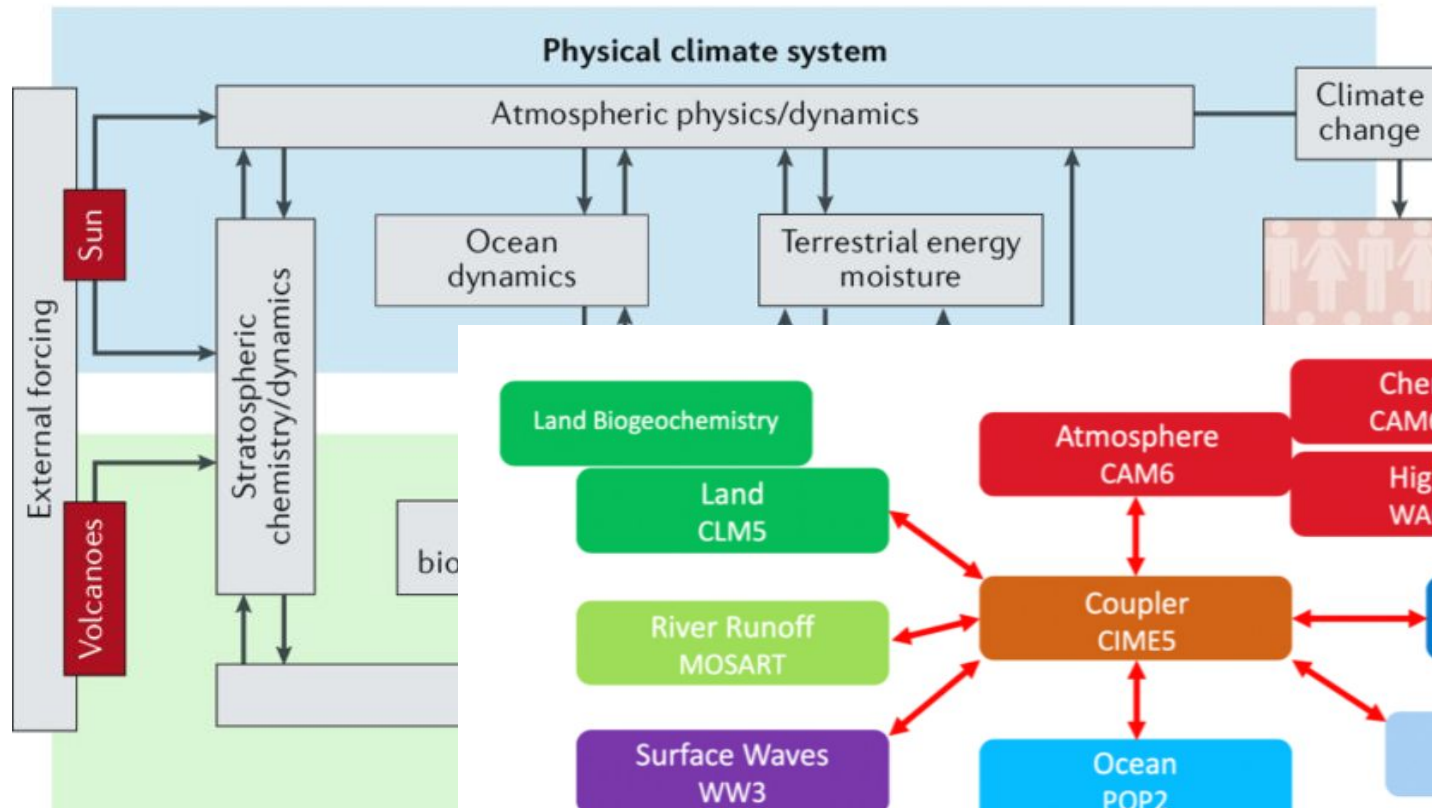


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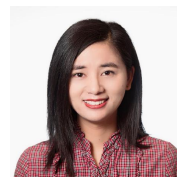
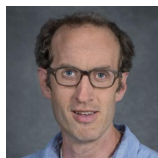
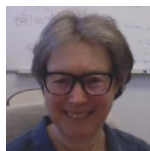
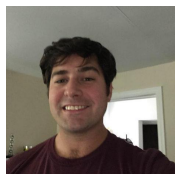
NCAR and CESM were key players in the development of the concept and creation of the first coupled carbon cycle models.

- + Coupled C-N biogeochemistry - CESM1
- + Explicit crop management - CESM2

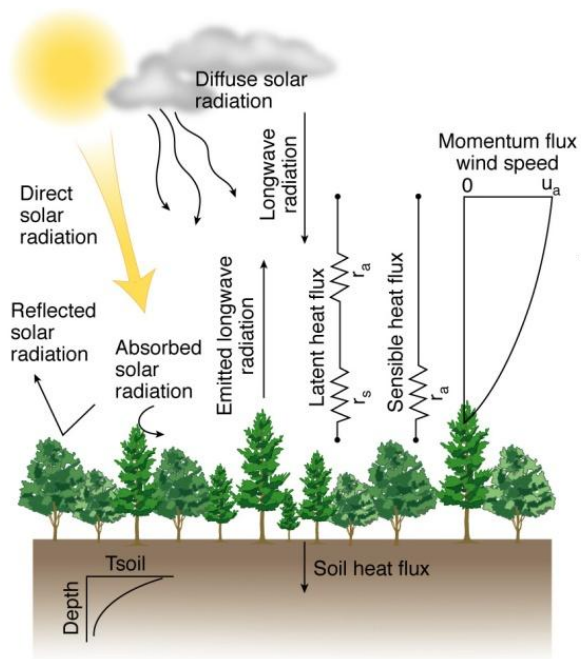




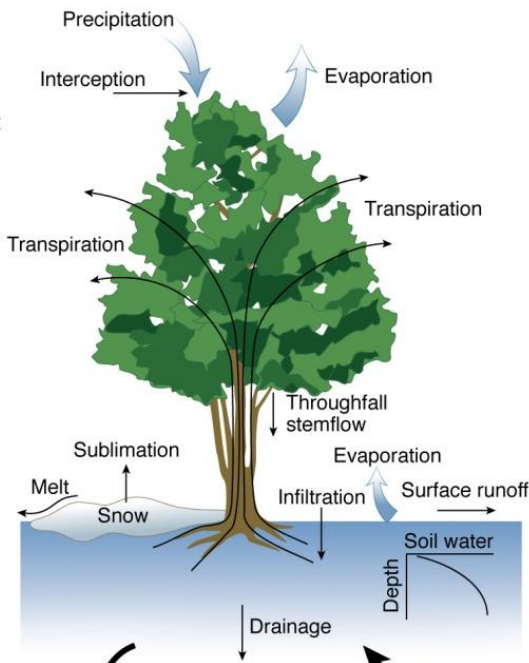
Community LAND MODEL DEVELOPMENT



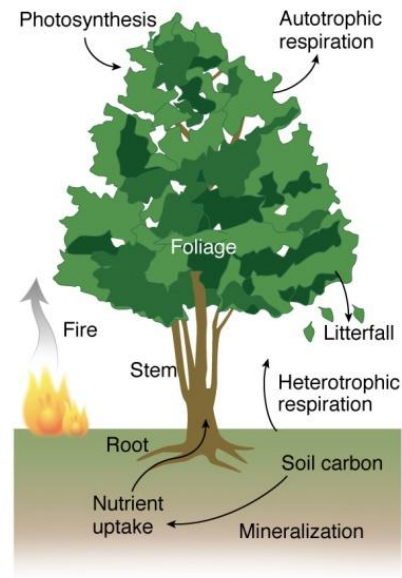
Surface energy fluxes



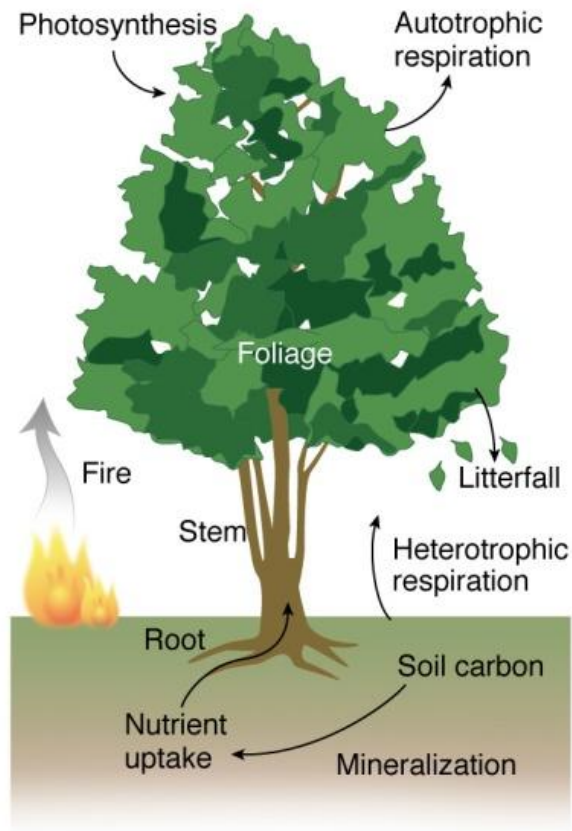
Hydrology



Carbon Cycle

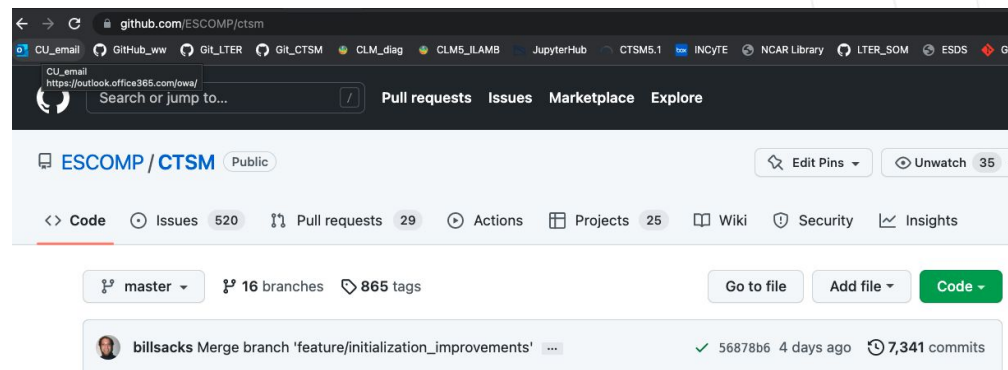
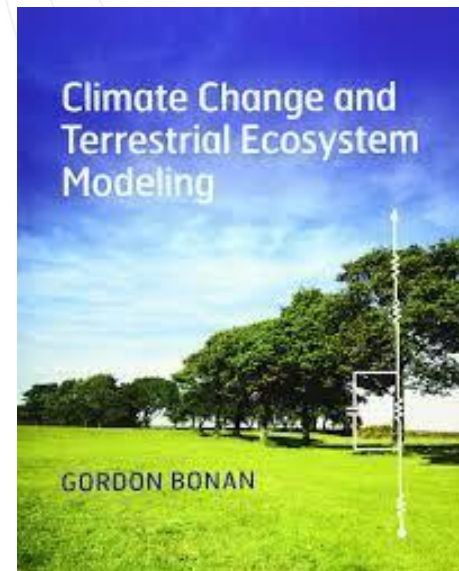


Bonan 2008, Science

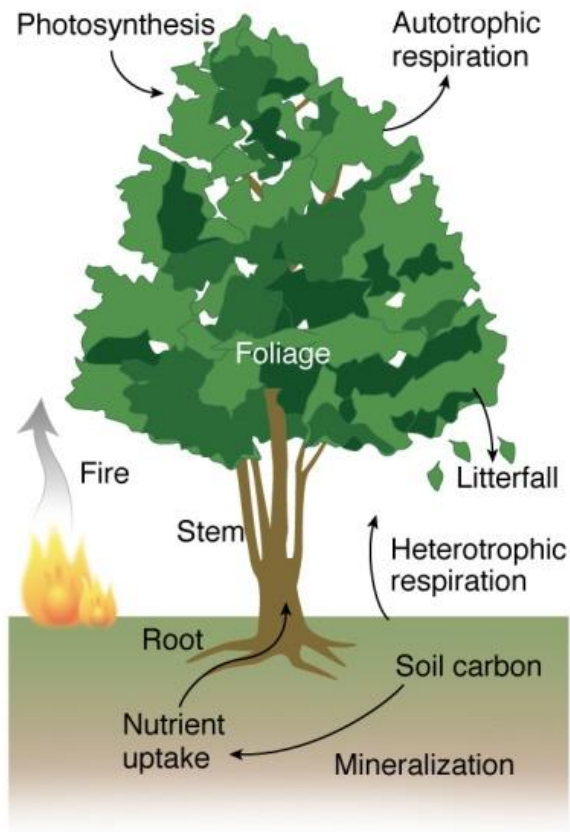


Bonan 2008, Science

LAND BIOGEOCHEMISTRY



<https://github.com/ESCOMP/ctsm>

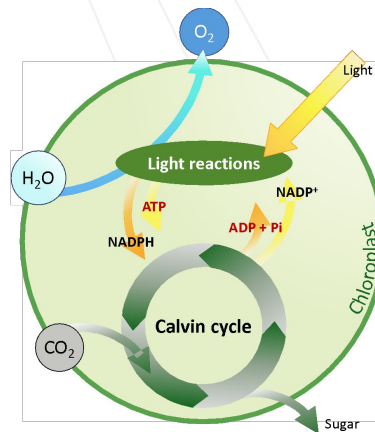
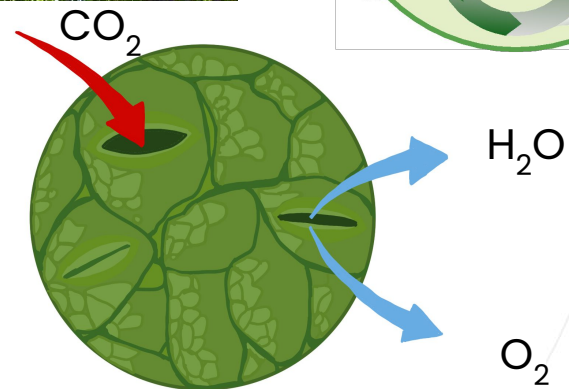
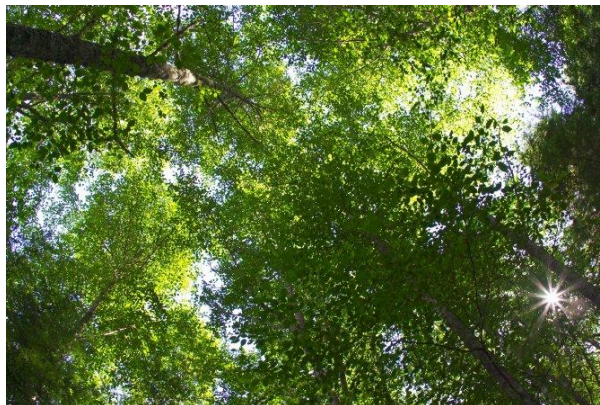


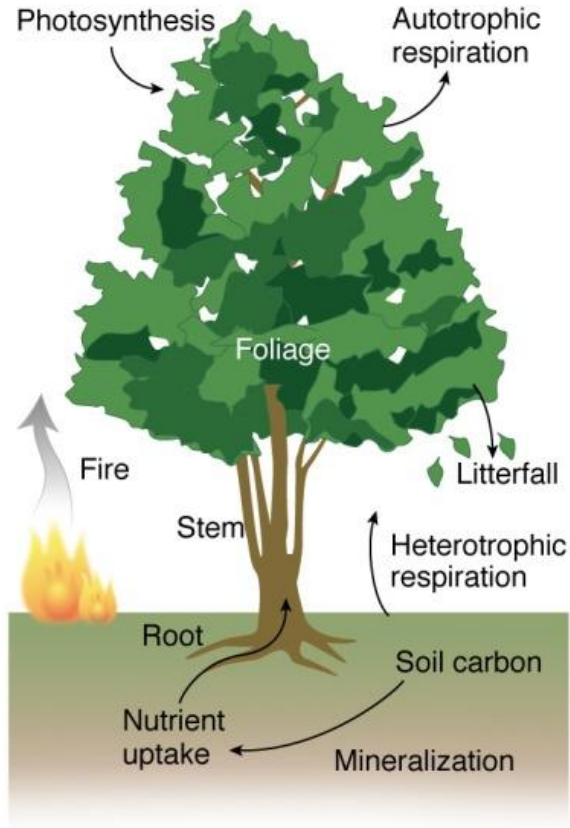
Bonan 2008, Science

Leaves

Photosynthesis

Stomatal Conductance





Bonan 2008, Science

Leaves

Photosynthesis

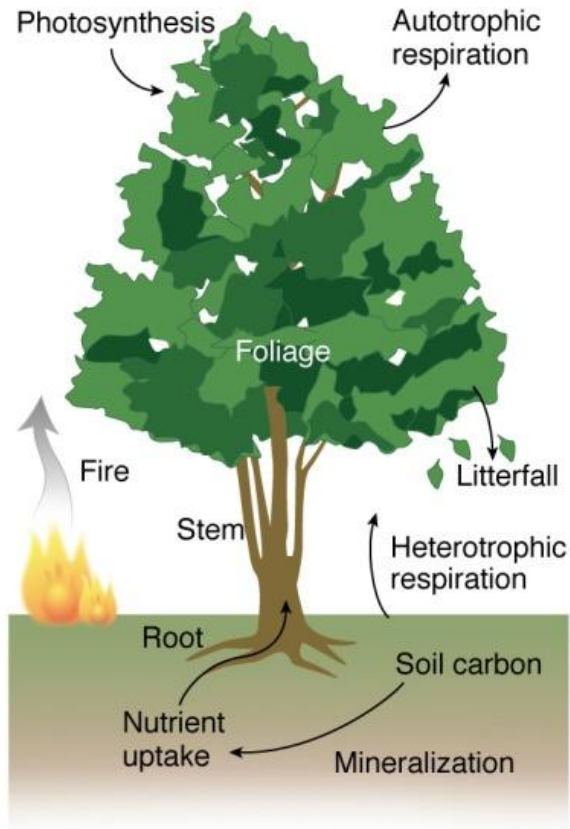
Stomatal Conductance

Canopy & Light

Two-stream radiation approximation,
sunlit/shaded leaf

GPP: Gross Primary Productivity





Bonan 2008, Science

Leaves

Photosynthesis

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Canopy & Light

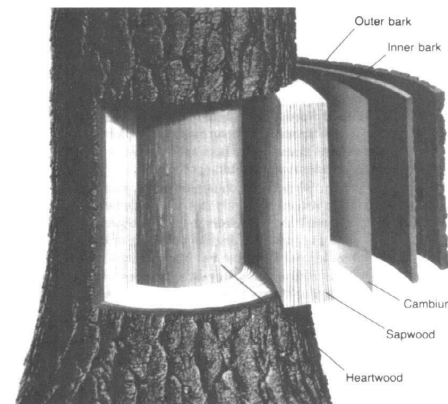
Two-stream radiation approximation,
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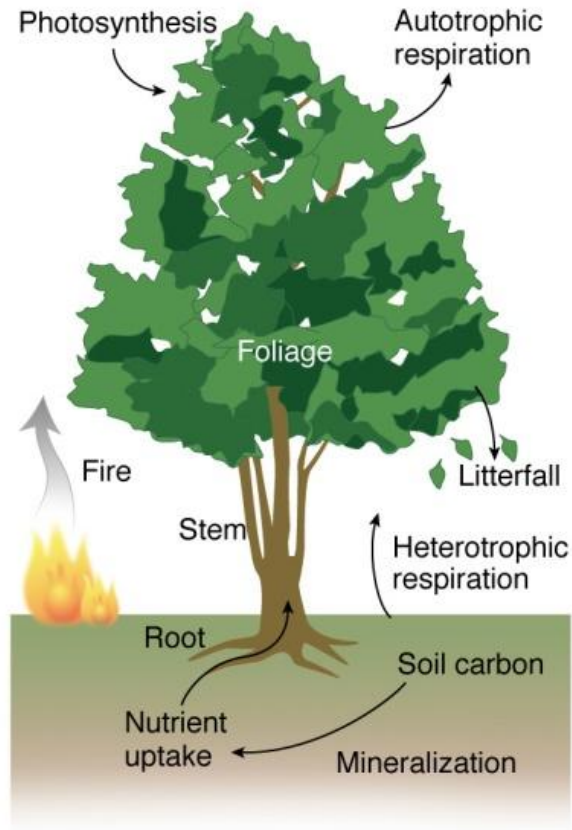
Allocation & Respiration

leaves, wood, roots

**AR: Autotrophic
respiration**

**NPP: Net Primary
Productivity = GPP
– AR**





Bonan 2008, Science

Leaves

Photosynthesis

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Two-stream radiation approximation,
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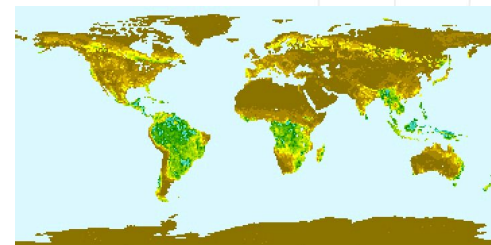
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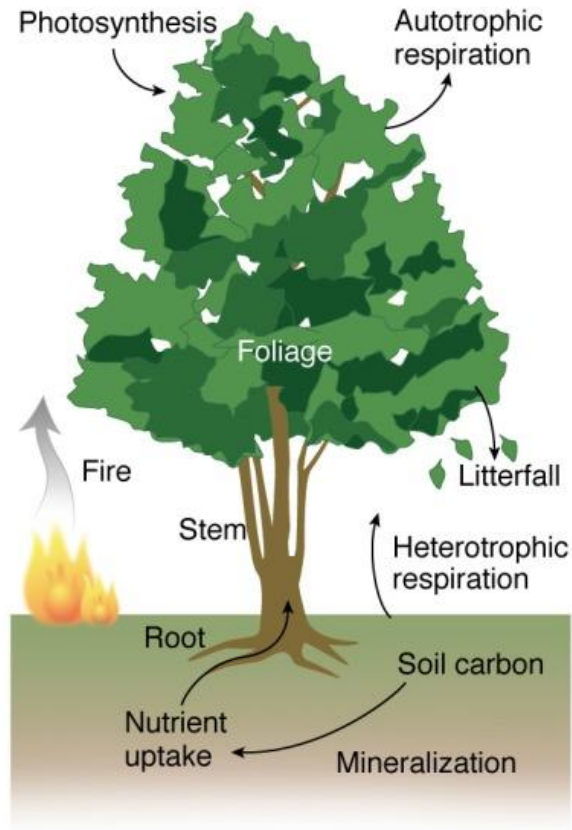
leaves, wood, roots

Phenology & Turnover

mortality, litter, etc.

LAI: Leaf area index





Bonan 2008, Science

Leaves

Photosynthesis

Stomatal Conductance

Canopy & Light

Two-stream radiation approximation,
sunlit/shaded leaf

Allocation & Respiration

leaves, wood, roots

Phenology & Turnover

mortality, litter, etc.

Decomposition

HR: heterotrophic respiration

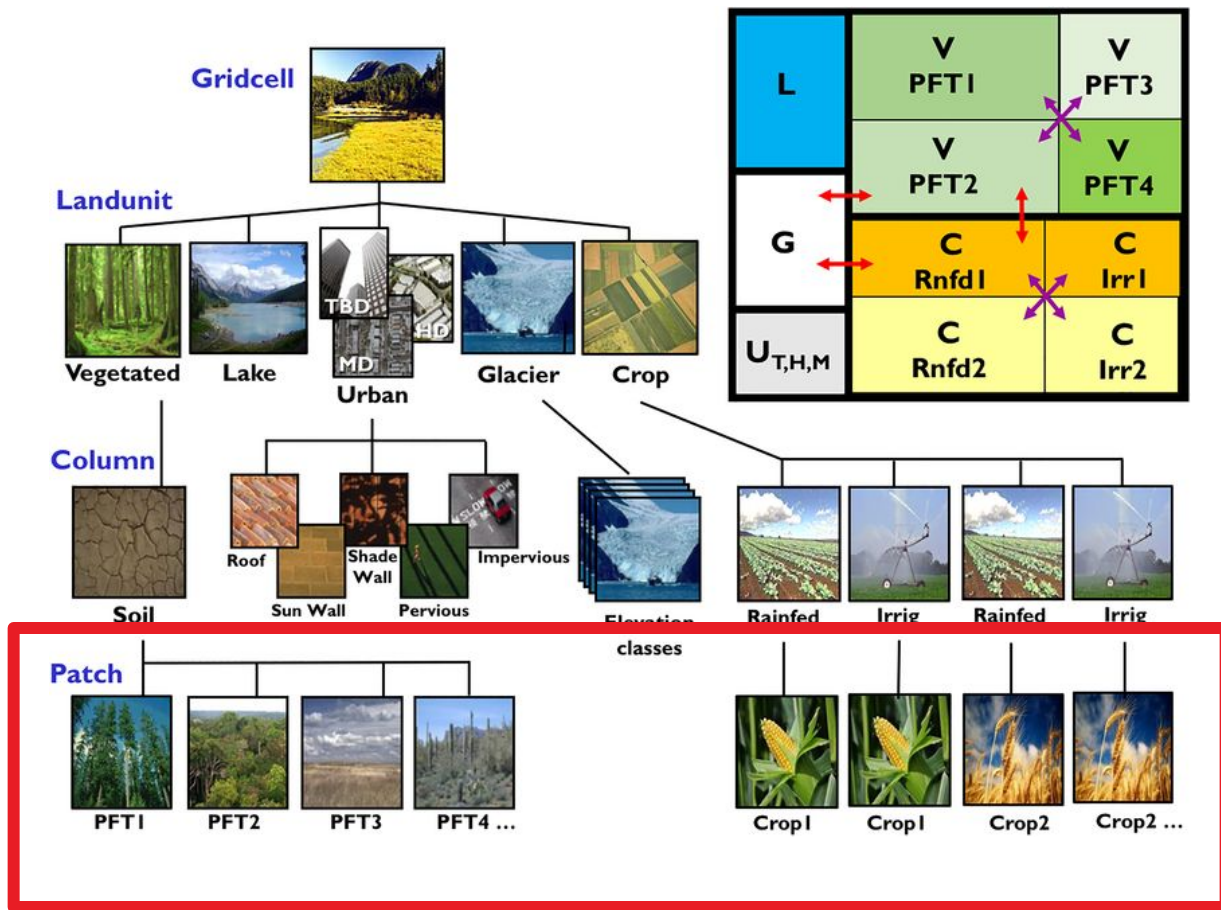


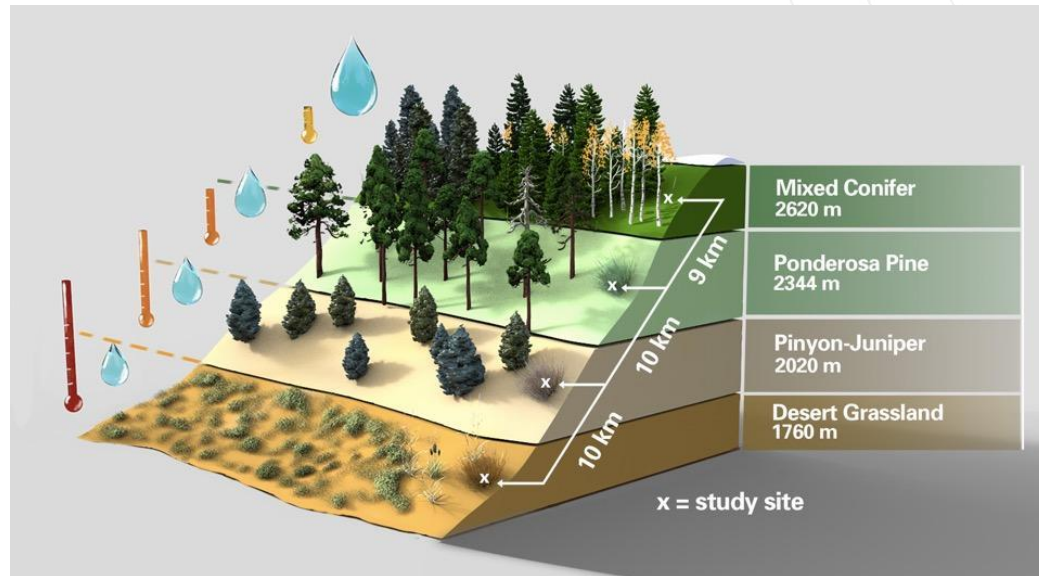
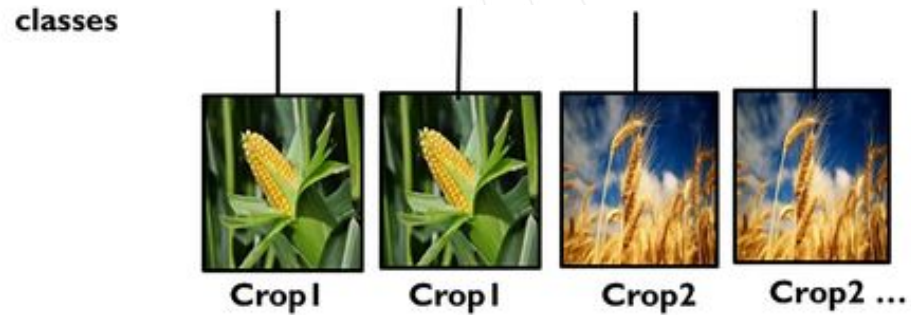
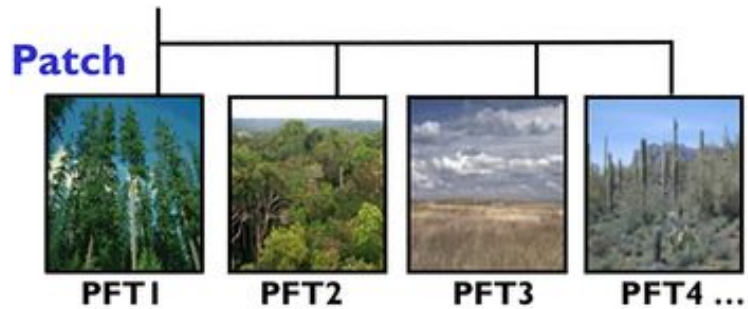


NEP: Net Ecosystem Production = GPP - AR - HR

NEE: Net Ecosystem Exchange = NEP - fire loss

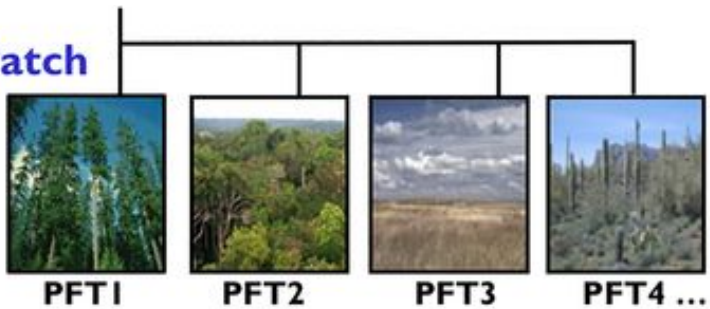
NBP: Net Biome Production = NEE - land use - harvest



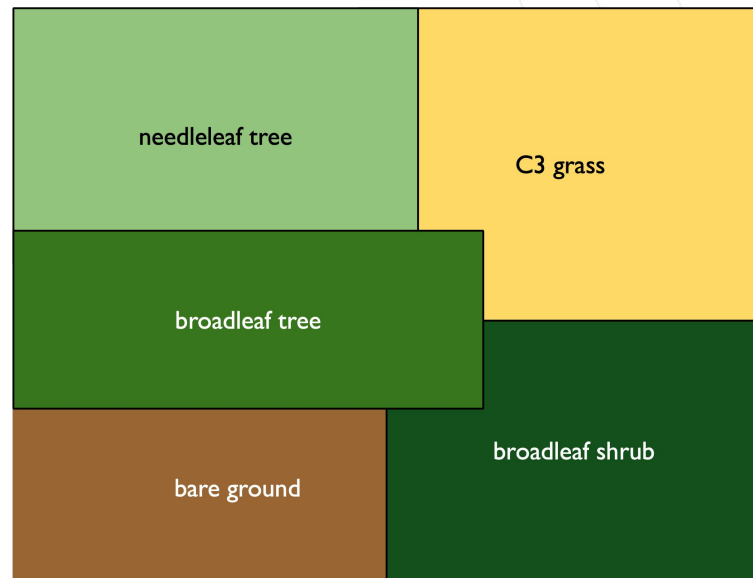
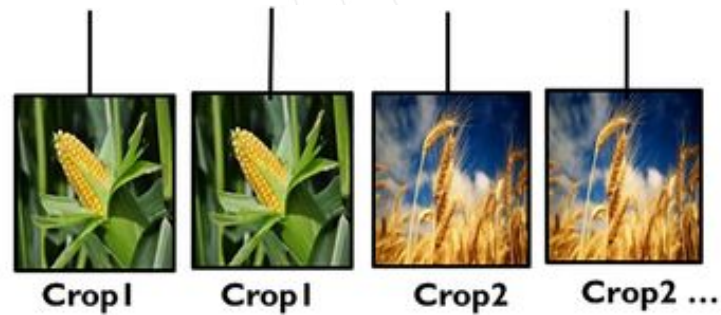


Lawrence et al 2019, JAMES
<https://github.com/ESCOMP/ctsm>

Patch



classes



Lawrence et al 2019, JAMES
<https://github.com/ESCOMP/ctsm>

Agriculture in CLM



Corn



Wheat



Sugarcane



Soy



Cotton



Rice



Fertilize



Irrigate



Transient fertilizer and irrigation (1850 – 2100)

Where do parameter values come from?



Laboratory understanding of plant physiological processes

e.g., Farquhar. Photosynthesis is co-limited by light, energy, export of sugars

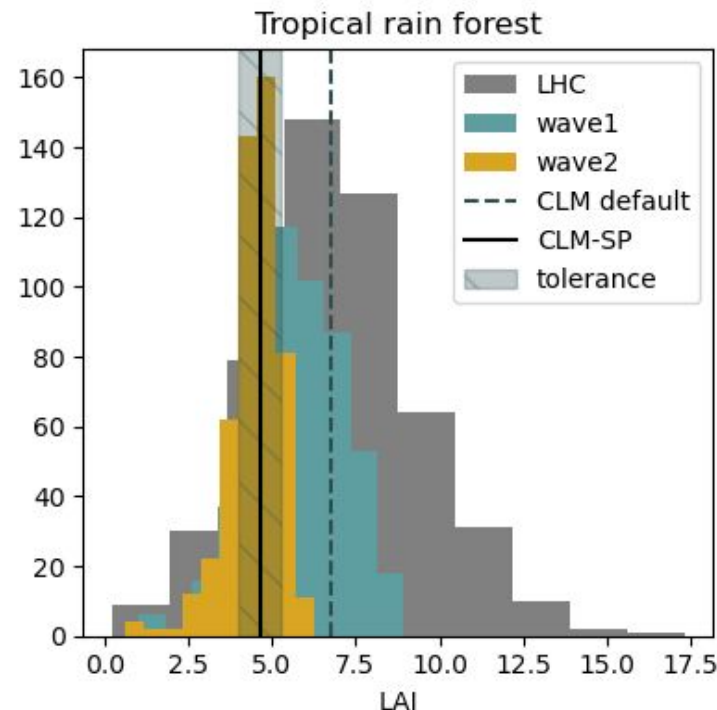
Trait databases

e.g., TRY Database (Leaf N and dark respiration)

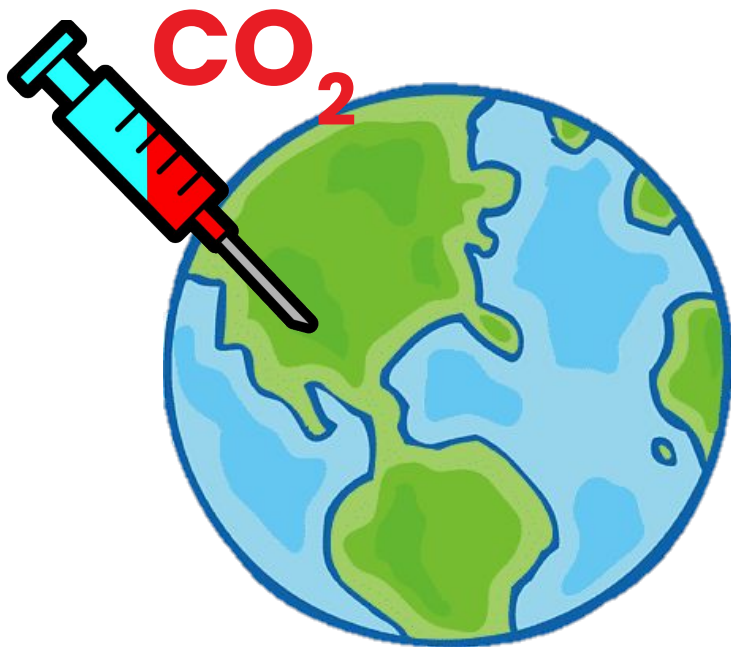
Optimality theory: plants try to optimize things like water use efficiency

e.g., FUN and LUNA modules

Calibration!



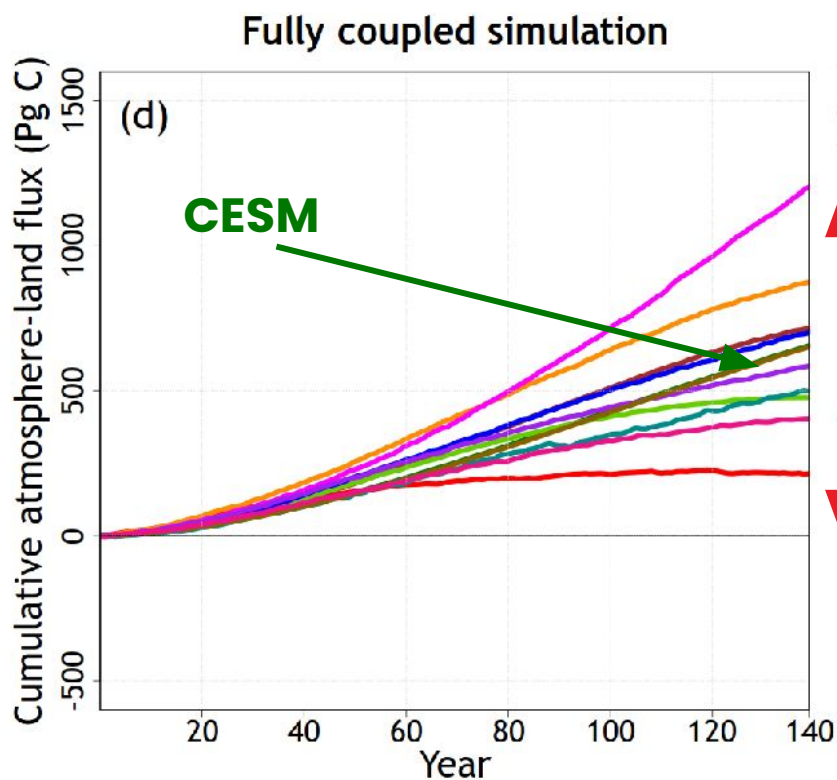
Hawkins, et al. in prep



1% CO₂ / year
Land & Ocean uptake
Temperature change

Three experiments:

1. Fully coupled
2. Biogeochemically coupled
3. Radiatively coupled



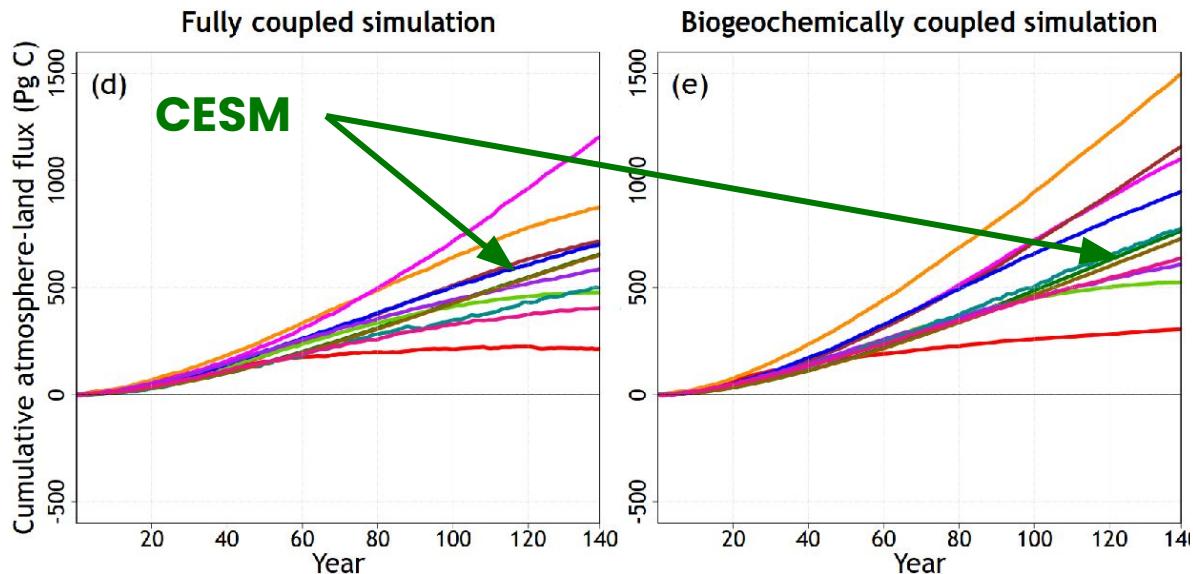
CMIP6 models

- ACCESS-ESM1.5
- BCC-CSM2-MR
- CanESM5
- CESM2
- CNRM-ESM2-1
- IPSL-CM6A-LR
- MIROC-ES2L
- MPI-ESM1.2-LR
- NOAA-GFDL-ESM4
- NorESM2-LM
- UKESM1-0-LL

large uncertainty in
magnitude of land sink

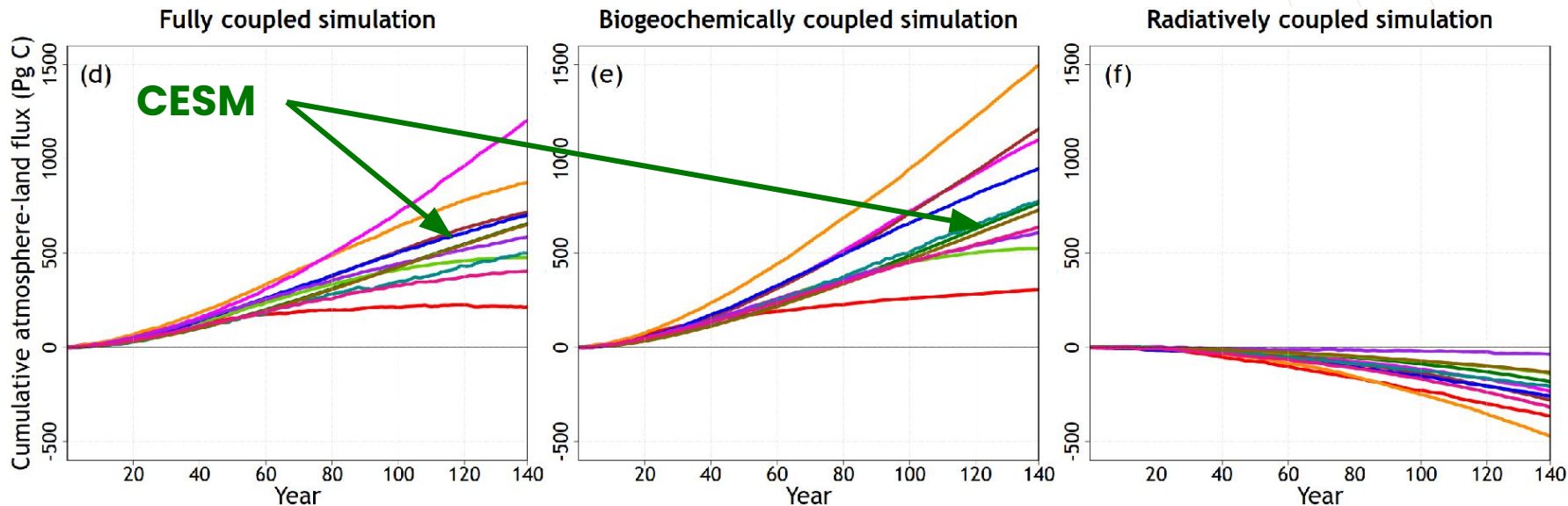
Cumulative land CO₂ sink

Cumulative land CO₂ sink

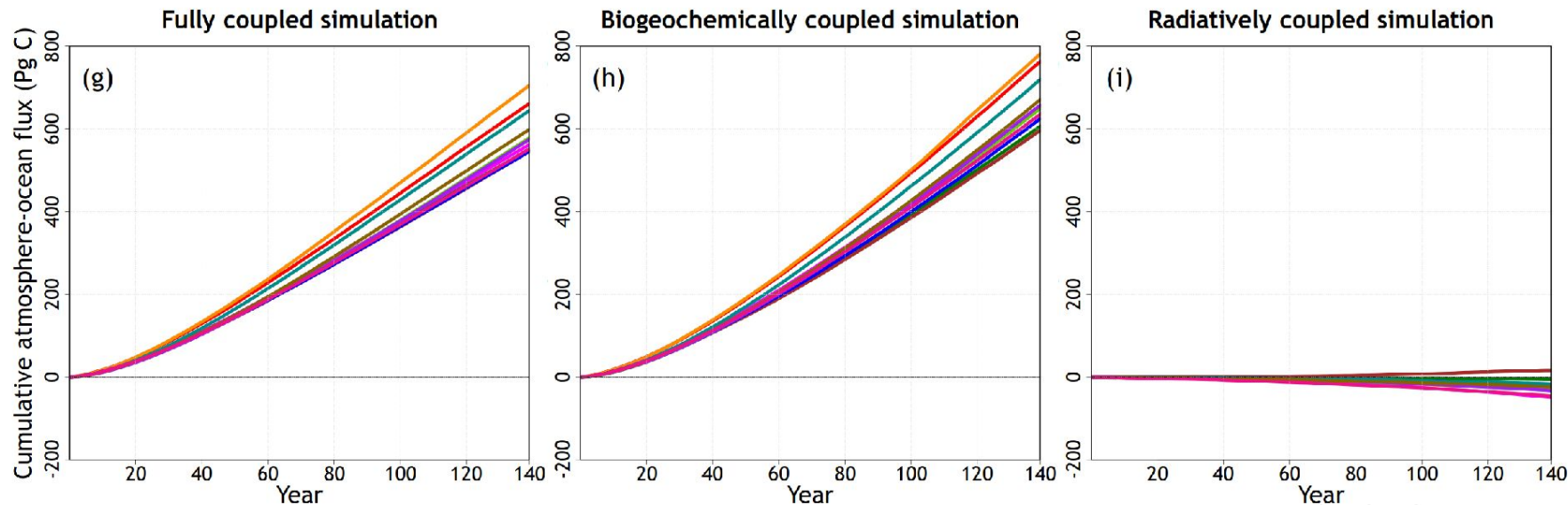


still large
uncertainty in
magnitude of
land sink

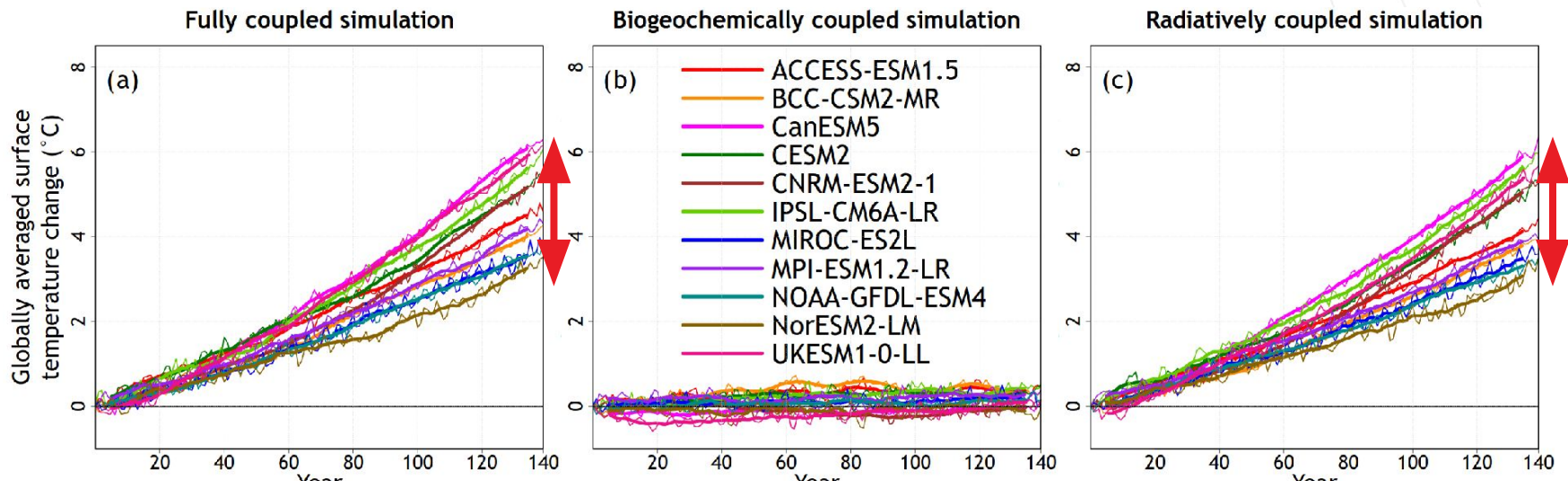
Cumulative land CO₂ sink



Cumulative ocean CO₂ sink



Global average surface temperature change ($^{\circ}\text{C}$)



Land biogeochemistry in CESM



Why?



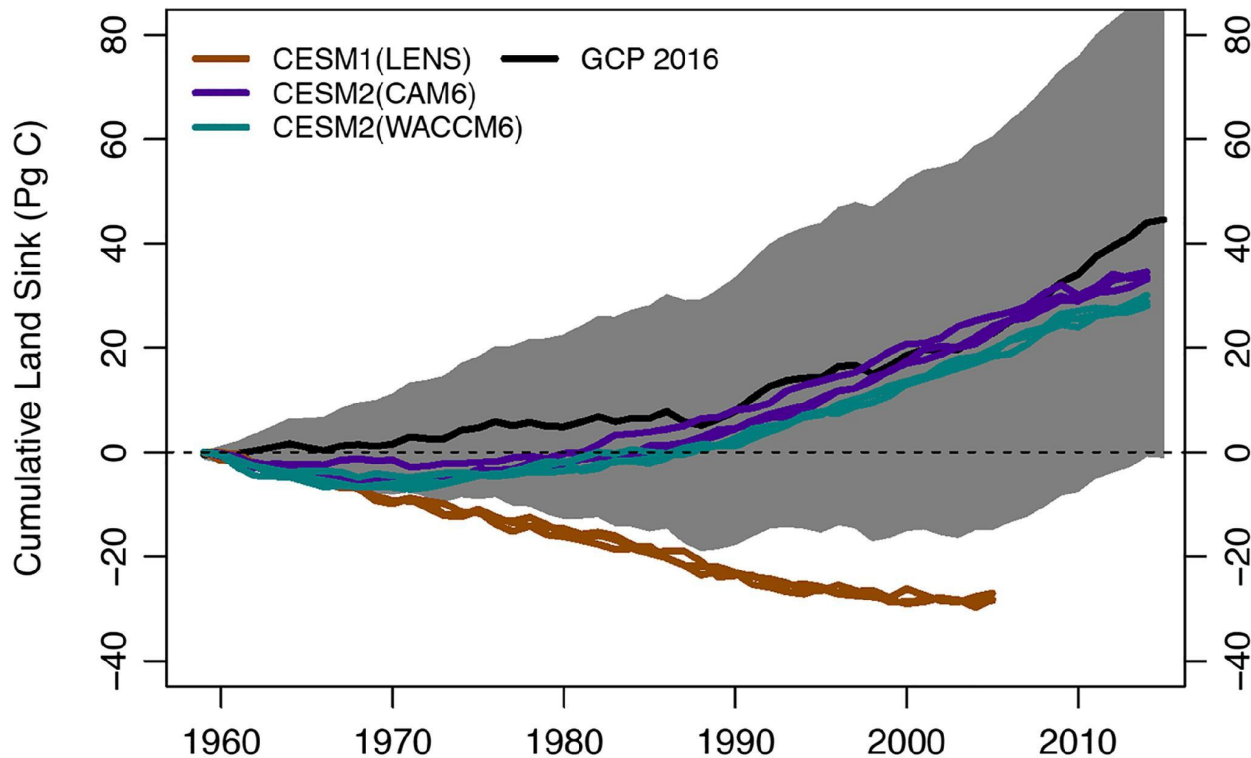
How?



Future directions



Representing the land sink



Representing the land sink



ILAMB – International Land Model Benchmarking package

	CESM1(1)	CESM1(5)	CESM1(10)	CESM2(1)	CESM2(2)	CESM2(3)
Ecosystem and Carbon Cycle						
Biomass						
Burned Area						
Carbon Dioxide						
Gross Primary Productivity						
Leaf Area Index						
Global Net Ecosystem Carbon Balance						
Net Ecosystem Exchange						
Ecosystem Respiration						
Soil Carbon						
Hydrology Cycle						
Evapotranspiration						
Evaporative Fraction						
Latent Heat						
Runoff						
Sensible Heat						
Terrestrial Water Storage Anomaly						
Permafrost						
Radiation and Energy Cycle						
Albedo						
Surface Upward SW Radiation						
Surface Net SW Radiation						
Surface Upward LW Radiation						
Surface Net LW Radiation						
Surface Net Radiation						

	CESM1(1)	CESM1(5)	CESM1(10)	CESM2(1)	CESM2(2)	CESM2(3)
Forcings						
Surface Air Temperature						
Diurnal Max Temperature						
Diurnal Min Temperature						
Diurnal Temperature Range						
Precipitation						
Surface Relative Humidity						
Surface Downward SW Radiation						
Surface Downward LW Radiation						
Relationships						
Burned Area vs Precipitation						
Burned Area vs Surf Air Temp						
GPP vs ET						
GPP vs Precipitation						
GPP vs Surf Down SW Radiation						
GPP vs Surf Net SW Radiation						
GPP vs Surf Air Temp						
LAI vs Precipitation						
ET vs Precipitation						
ET vs Surf Air Temp						

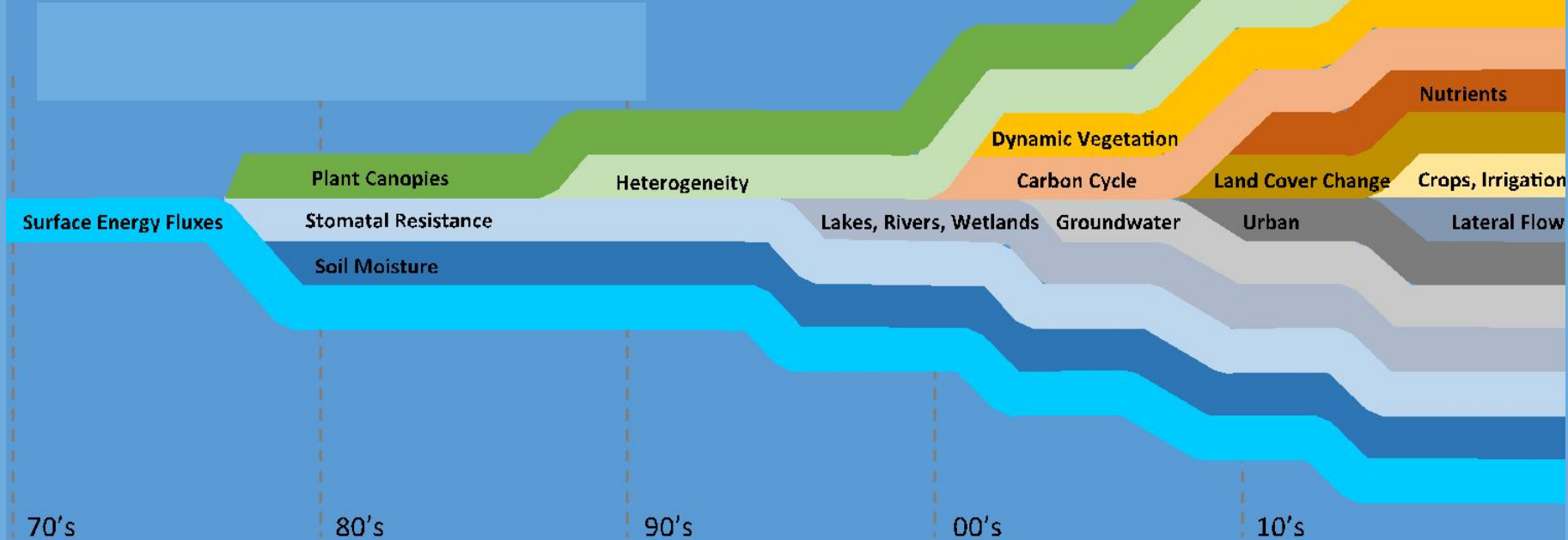


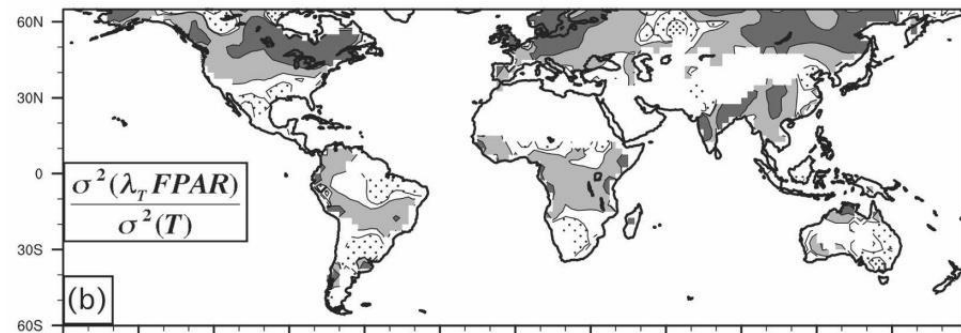
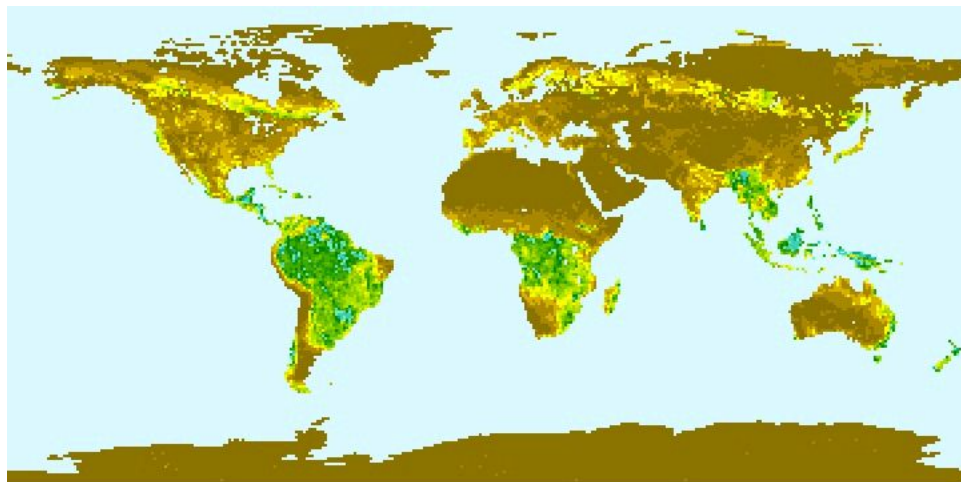
the Evolution of land modeling

Land as lower boundary
of atmosphere

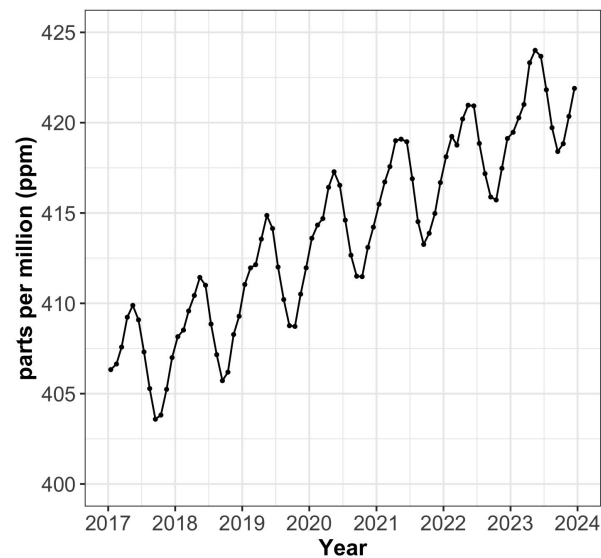


Land as integral component of
Earth System

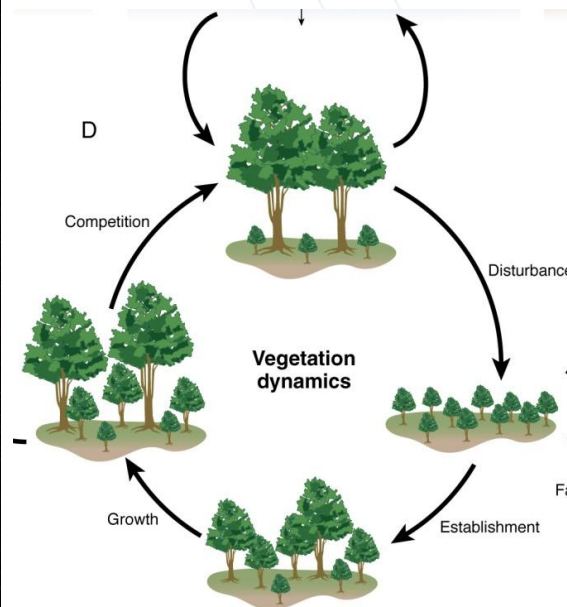




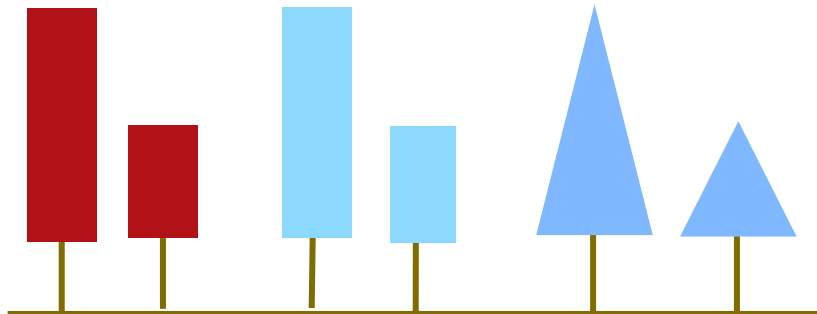
Recent monthly mean CO₂ at Mauna Loa Observatory



Forests are a mosaic of patches



FATES: Functionally Assembled Terrestrial Ecosystem Simulator

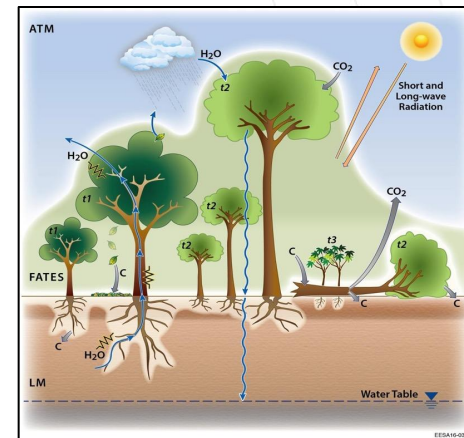


cohort-specific model

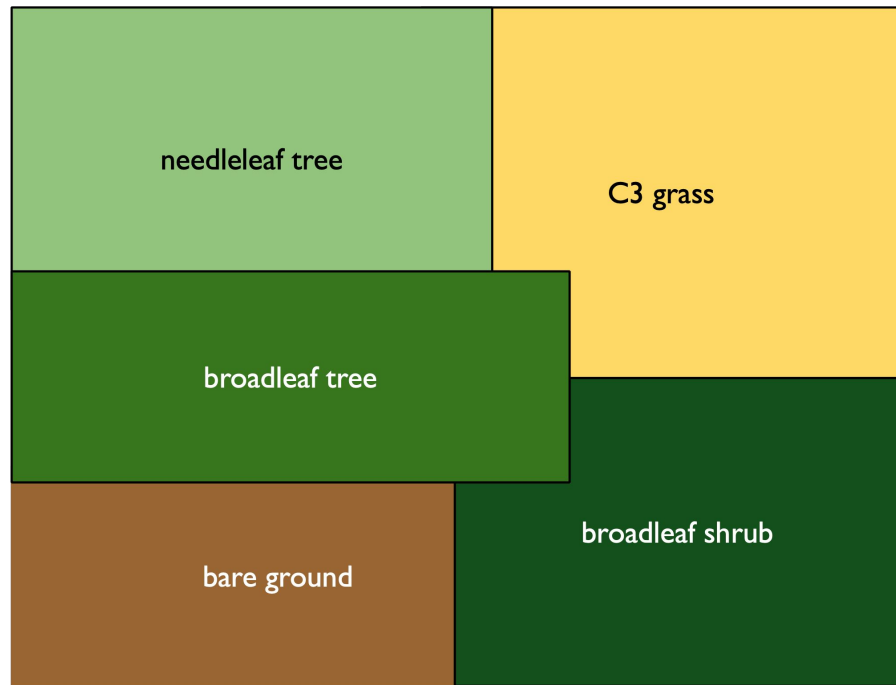
30-minute photosynthesis and fluxes

daily growth and allocation

dynamic vegetation!



Tiling differences



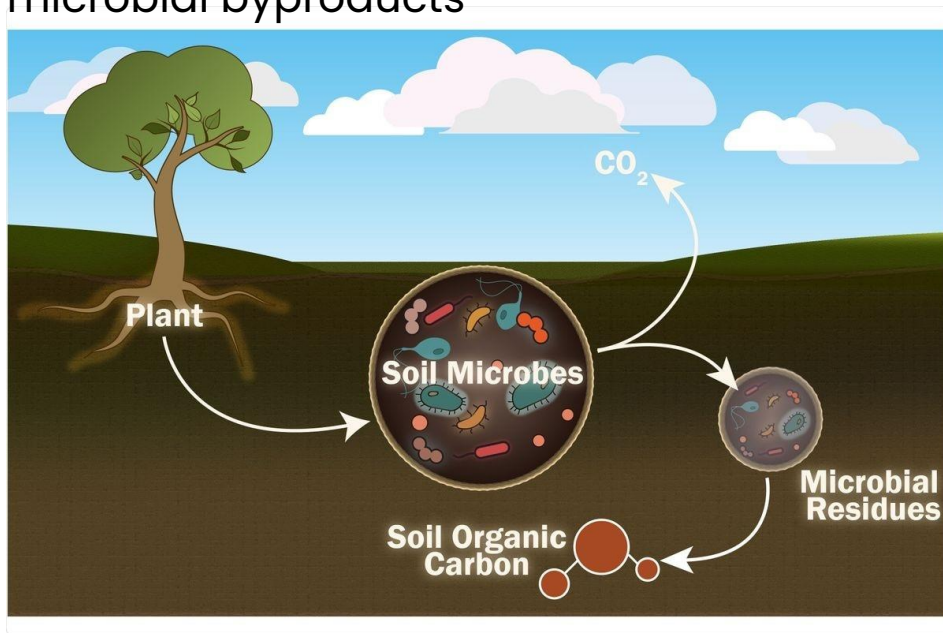


Each tile contains
cohorts of plants
of different PFT
and size

MIMICS: modeling microbial controls on soil carbon dynamics



Soil C model that considers relationships among litter quality, functional tradeoffs in microbial physiology, and microbial byproducts

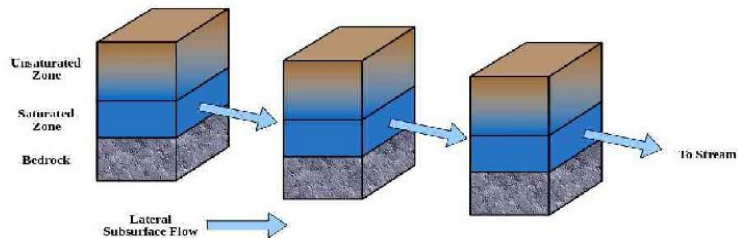


**More accurately
represents C
response to N
enrichment**

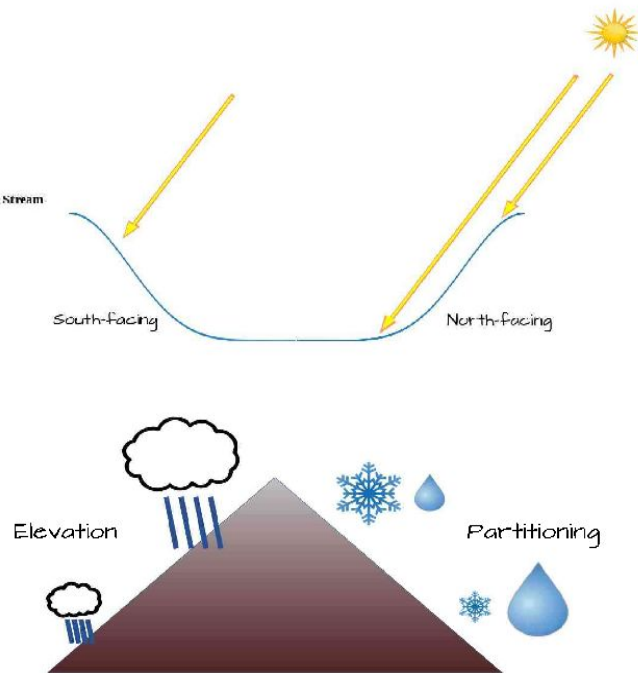
Representative hillslope model



Explicit Lateral Flow Within Gridcell



Downscaled Meteorology



How will ecosystems change when climate changes?



Community Terrestrial Systems Model:

Land model used for climate change that can be run at single points (~ 1 ha) to global scale.

FATES: Represents vegetation demographics, traits, and recovery from disturbance (feature within CTSM).

MIMICS: Soil biogeochemistry model (explicitly represent microbial activity and physiological diversity).

Hillslope Hydrology: Considers effects of aspect, elevation, and hydrologic connectivity on water availability (feature within CTSM).

