

Evaluation of the **Vegetation Optimality Model** along the **North-Australian Tropical Transect** using a fully **Open Science** approach

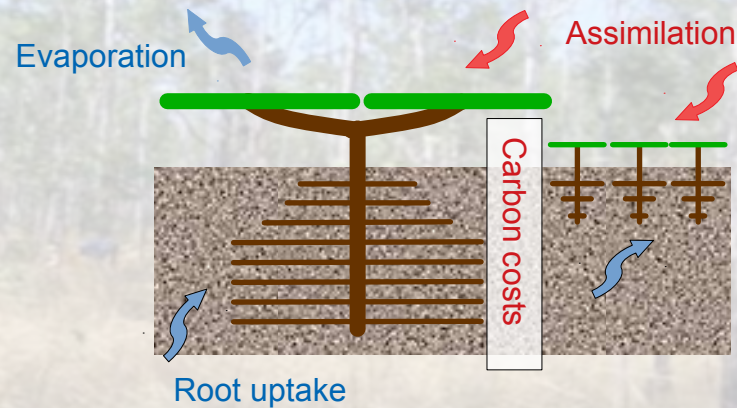
R.C. Nijzink¹, J. Beringer², L. Hutley³, C. Ramakrishnan⁴, R. Roskar⁴, S. Schymanski¹

¹ *Luxembourg Institute of Science and Technology, Belvaux, Luxembourg,*

² *University of Western Australia, Crawley, Australia*

³ *Charles Darwin University, Darwin, NT, Australia*

⁴ *Swiss Data Science Center, Zurich, Switzerland*



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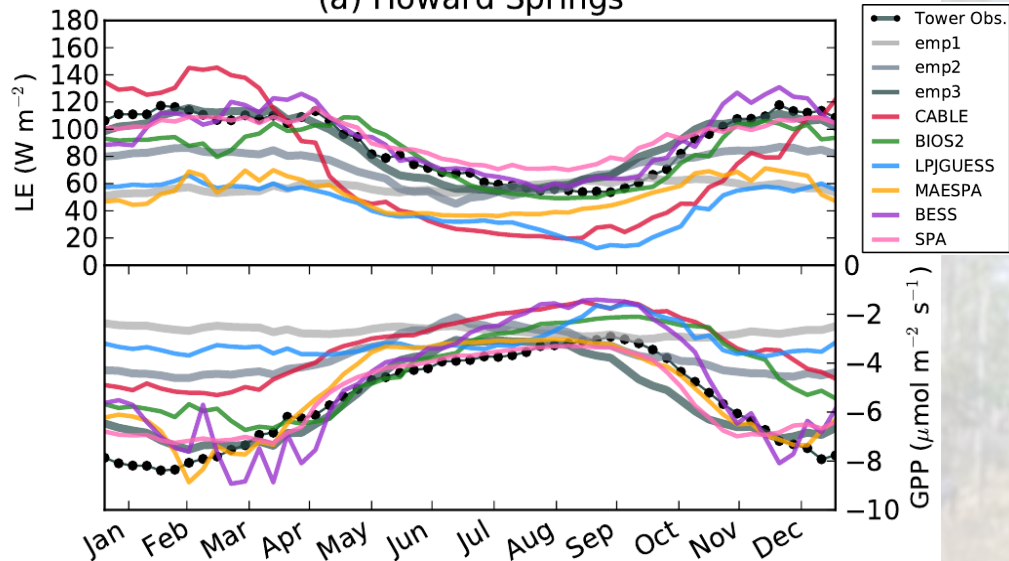
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Knowledge graph

Renku workflow

(a) Howard Springs



Whitley et al. (2015): Biogeosciences 13

Land Surface Models today:

...produce very different
results for unclear reasons

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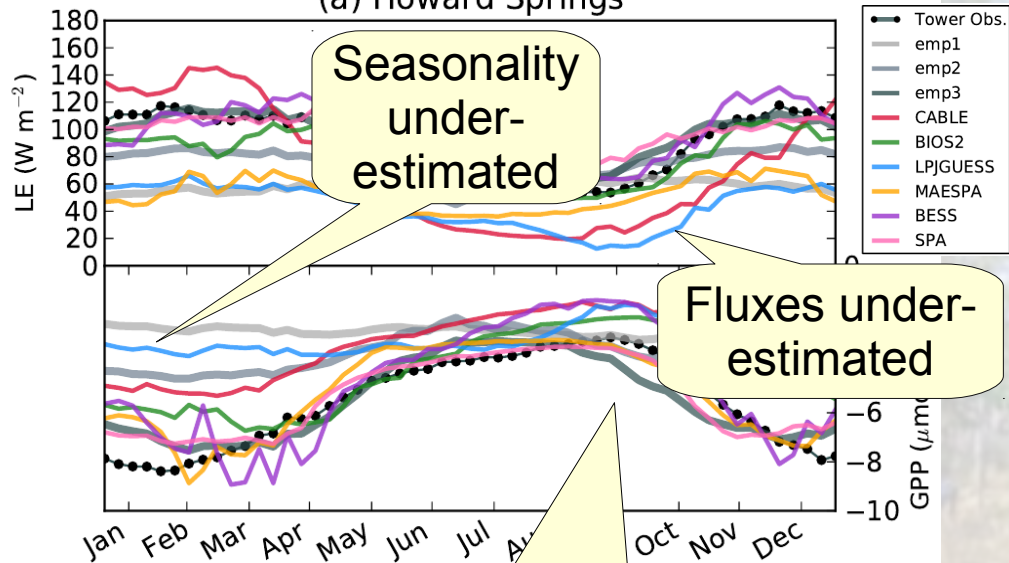
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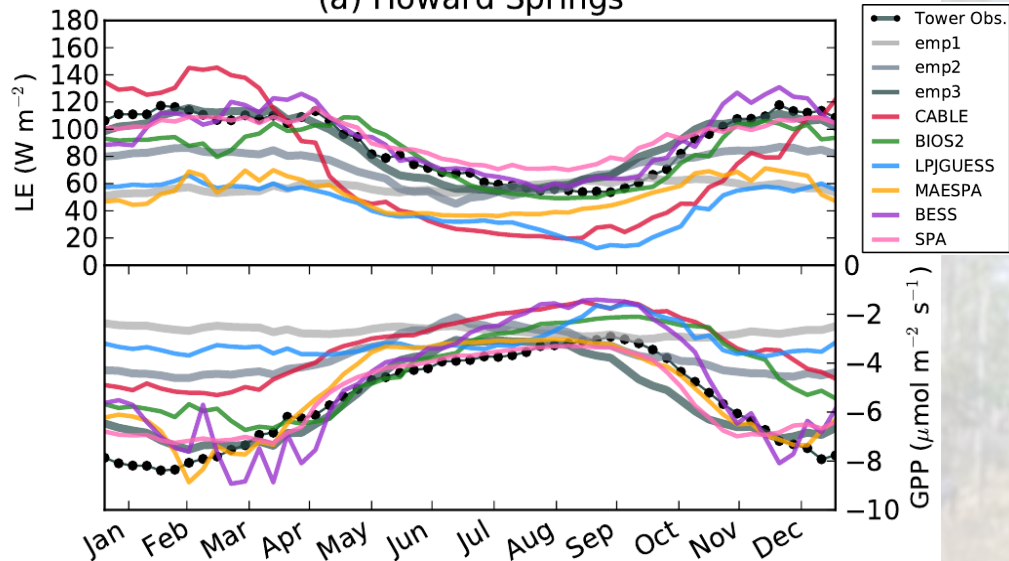
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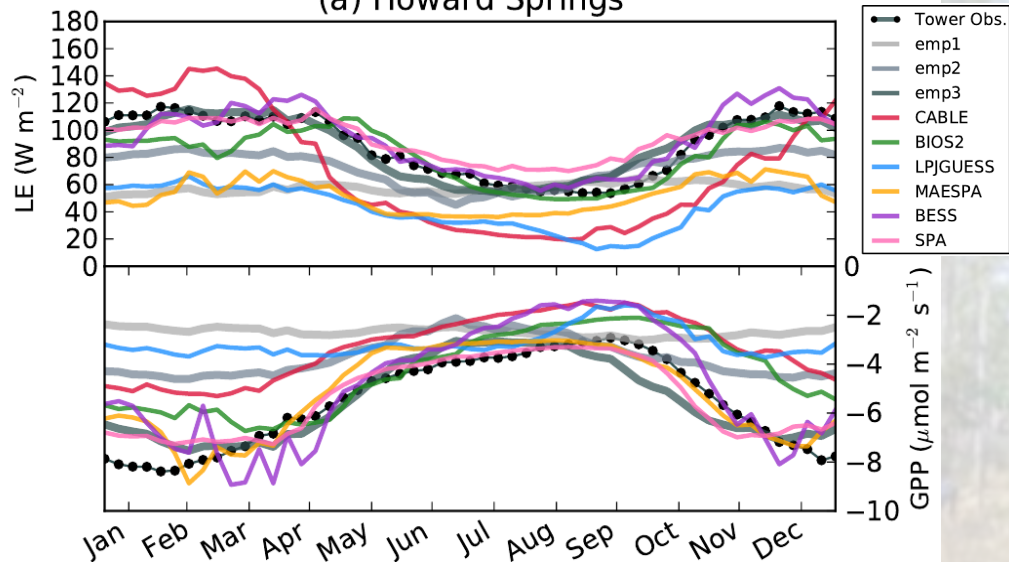
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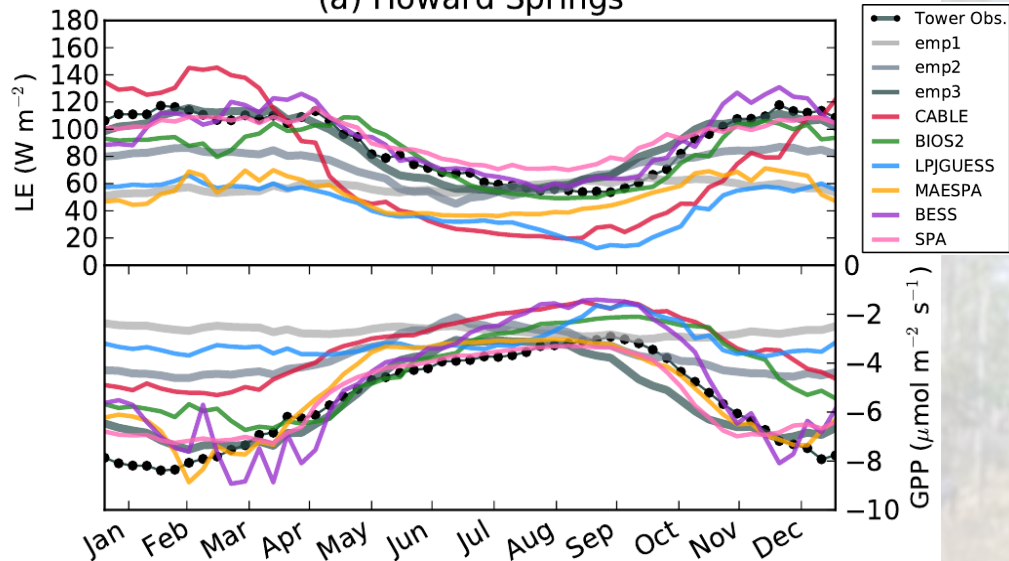
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Land Surface Models today:

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...cannot simulate full response to change due to prescribed properties

And how about reproducibility and repeatability?

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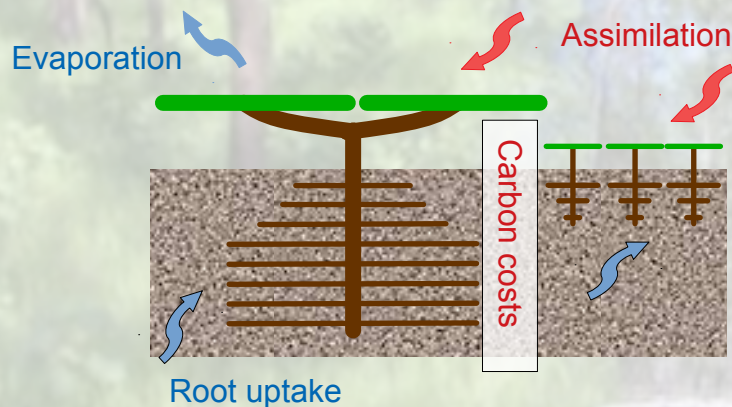
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VEGETATION OPTIMALITY

Net Carbon Profit :

Difference carbon uptake and carbon costs



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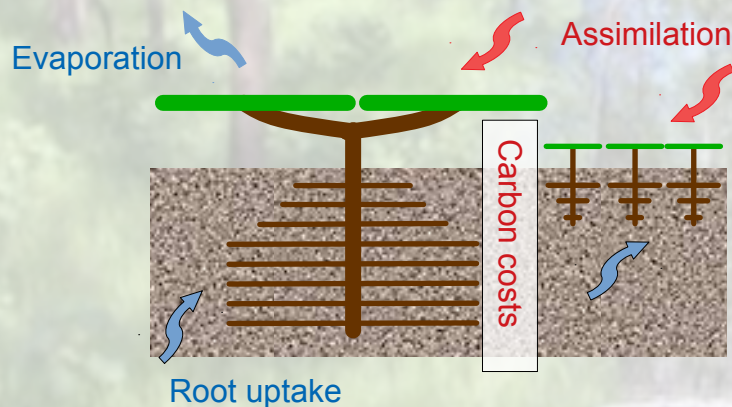
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Vegetation Optimality Model

Optimizes vegetation properties to maximize **NCP**

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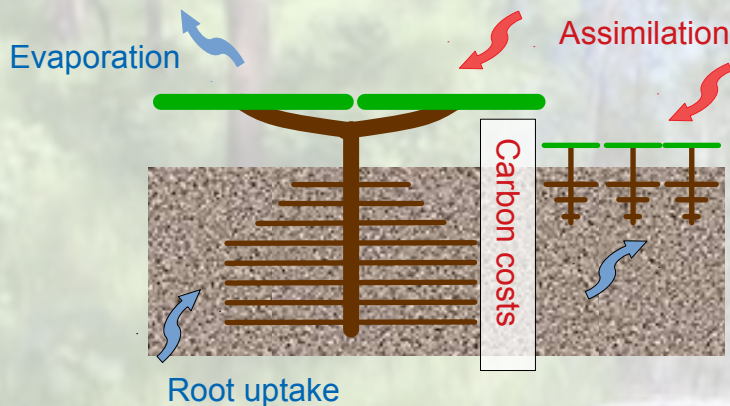
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Vegetation Optimality Model

Optimizes vegetation properties to maximize NCP

No vegetation data needed

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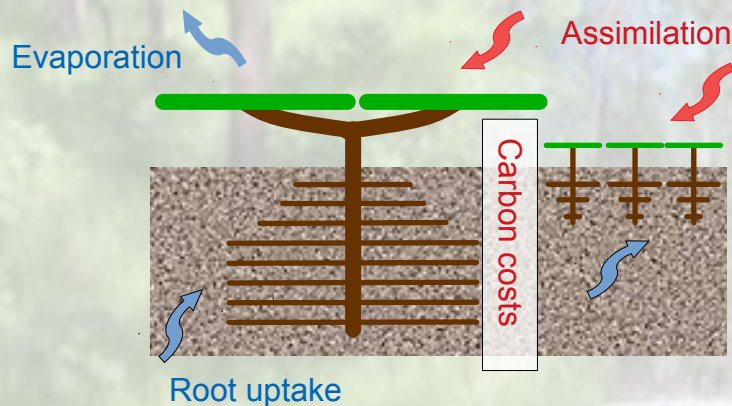
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Vegetation Optimality Model

Optimizes vegetation properties to maximize NCP

No vegetation data needed

Dynamically adapts to change

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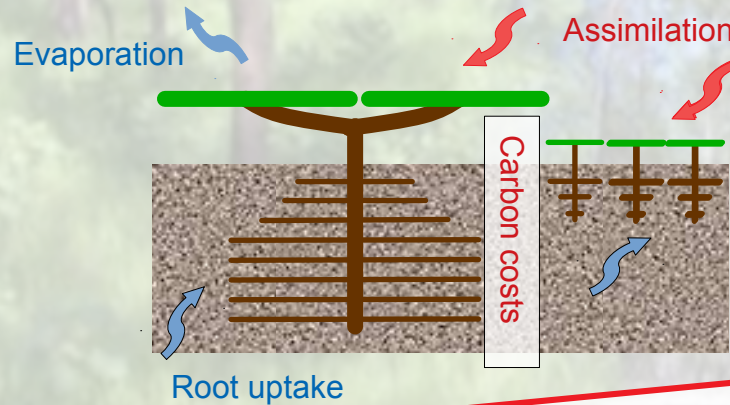
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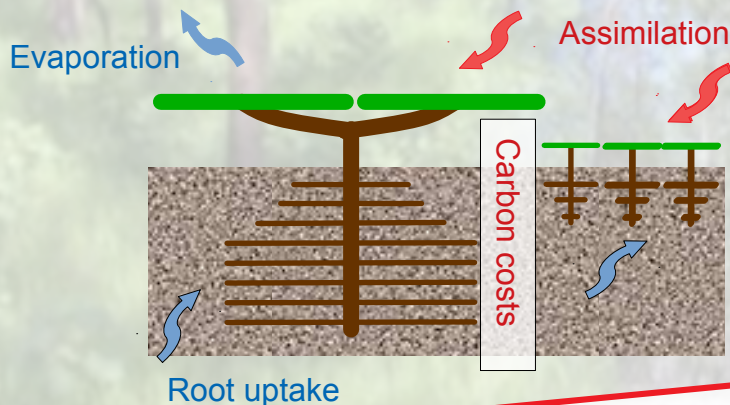
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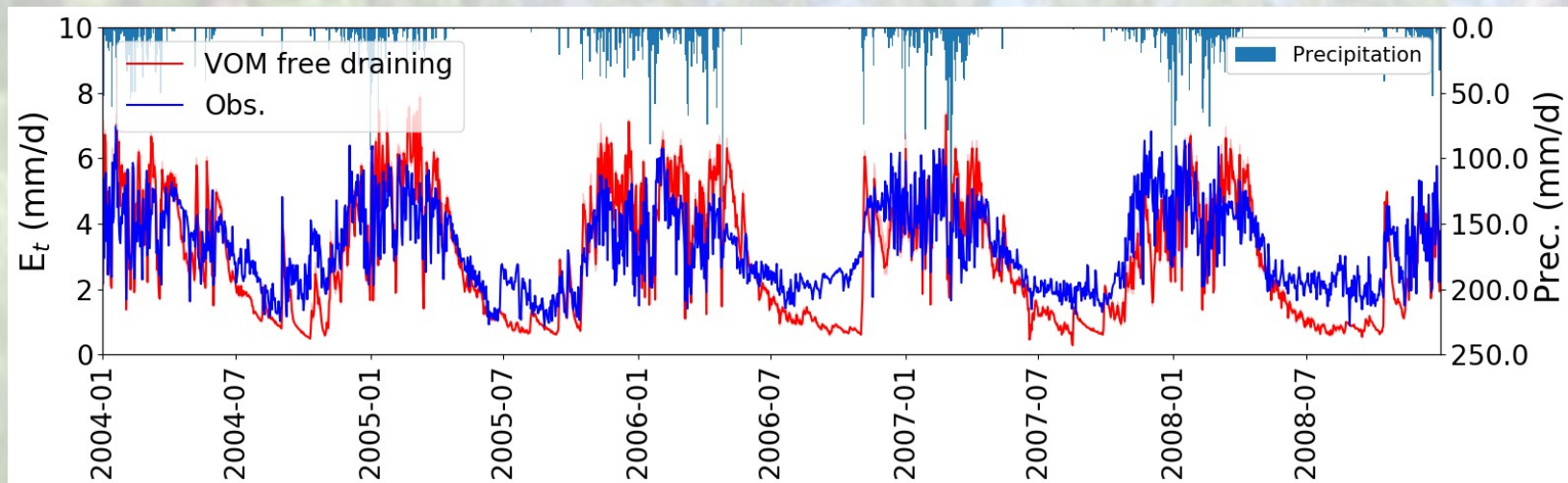
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Evaporation is quite right!

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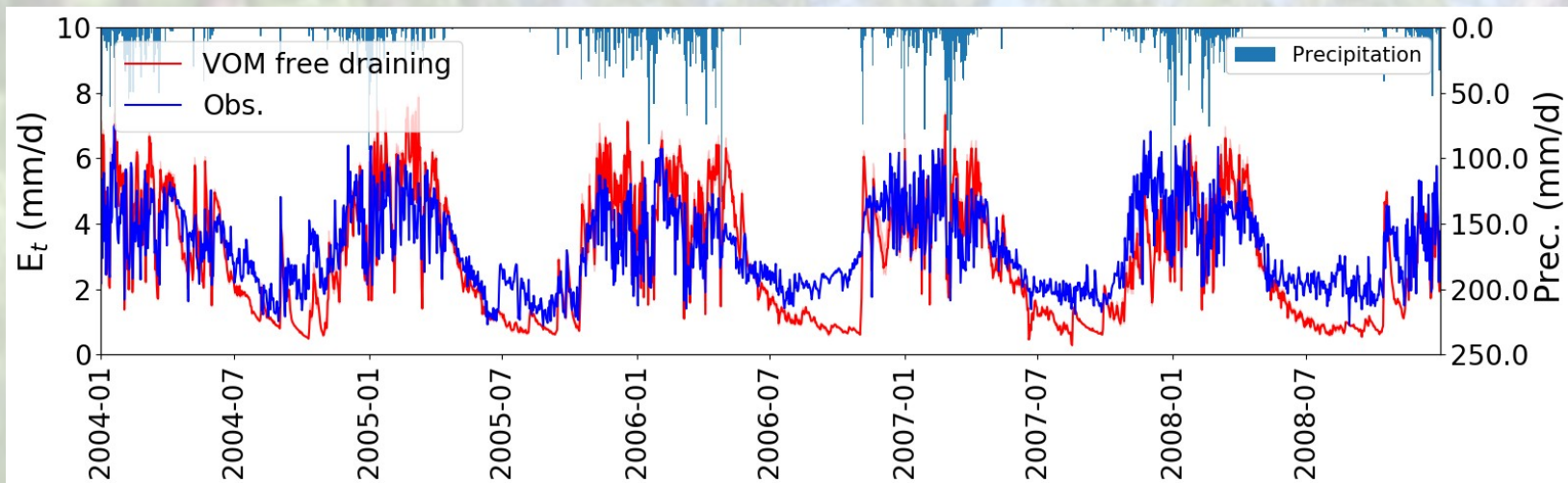
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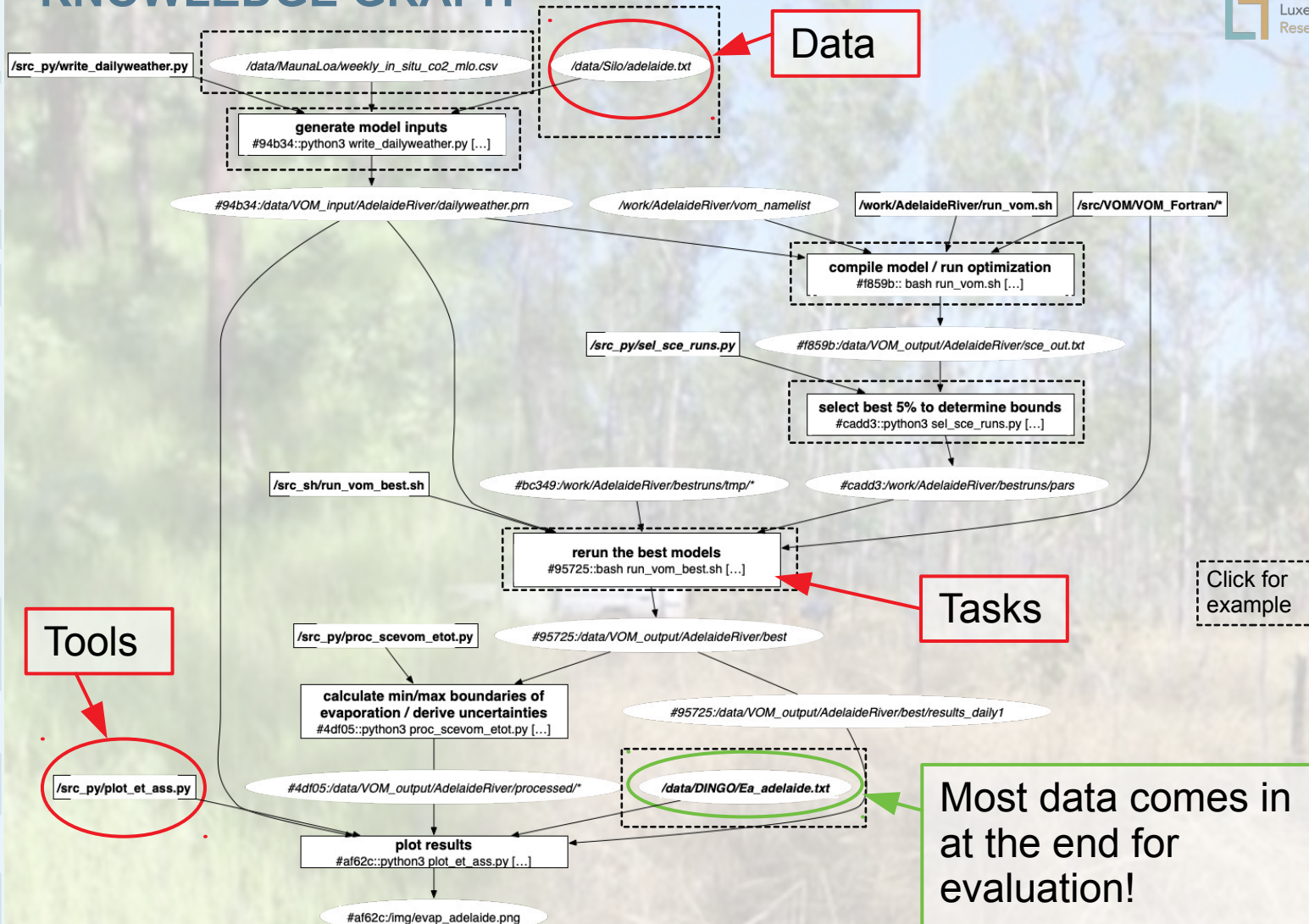
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With less data!

Evaporation is quite right!

KNOWLEDGE GRAPH



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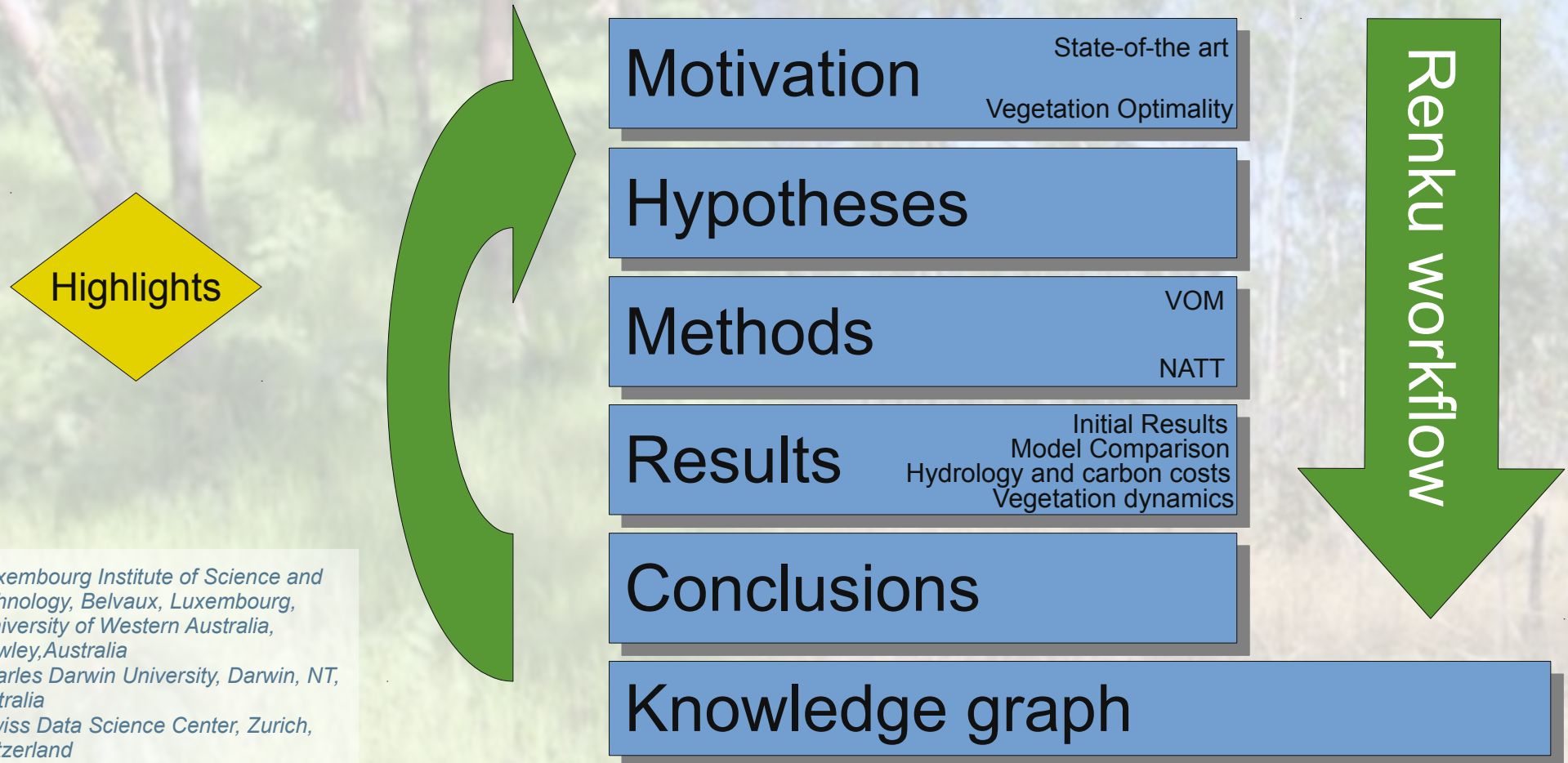
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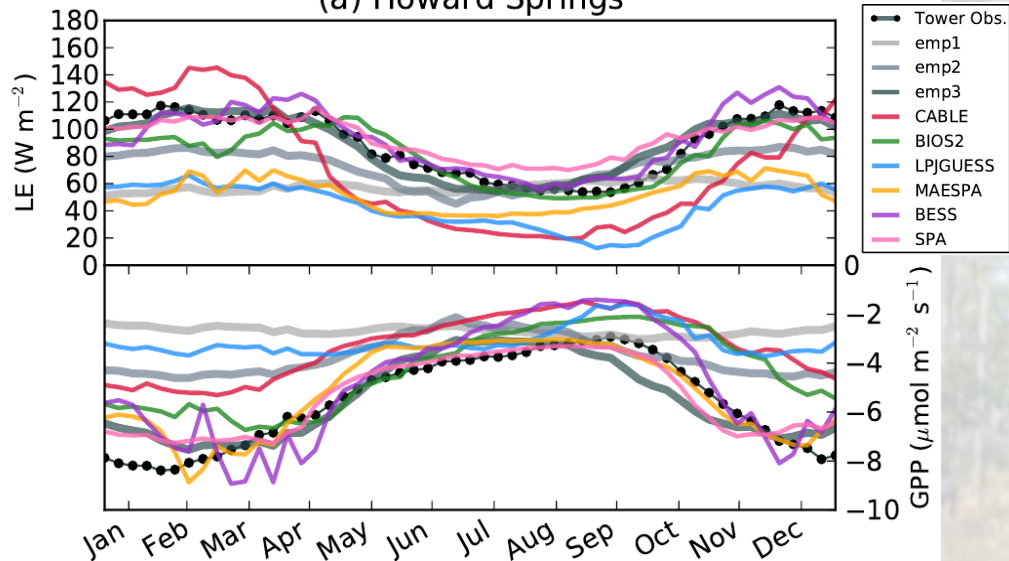
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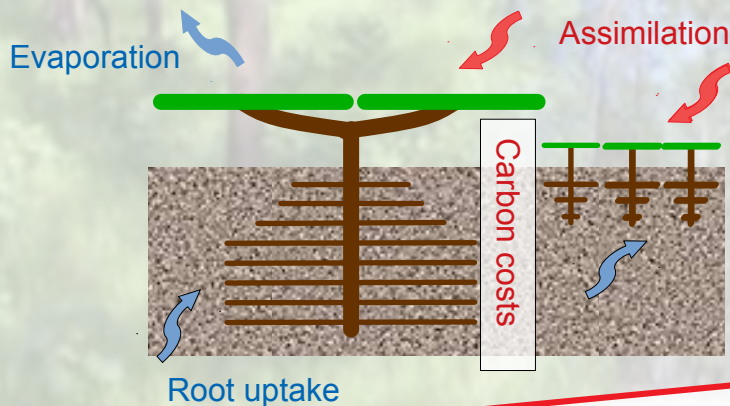
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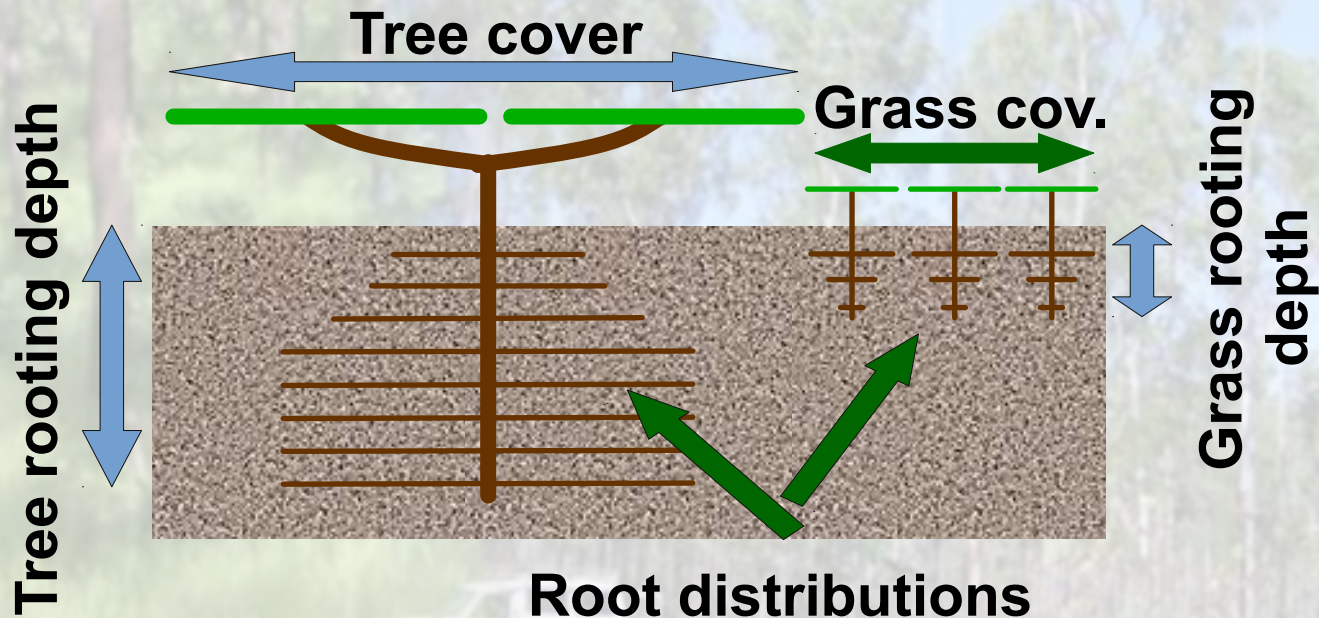
- Observed vegetation dynamics in tropical savanna sites can be explained by the maximization of **Net Carbon Profit**.
- Optimization of vegetation properties for the **Net Carbon Profit** leads to reduced data requirements for Land Surface Models
- **Hydrological formulation** of Land Surface Models matters for flux exchanges

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VEGETATION OPTIMALITY MODEL



Optimized constants

- Tree cover fraction
- Tree rooting depth
- Grass rooting depth
- Water use strategies

Dynamically optimized variables:

- Grass cover fraction
- Photosynthetic capacity
- Stomatal conductances
- Fine root surface area

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VEGETATION OPTIMALITY MODEL

Getting the hydrology right:

- Groundwater influences root water uptake
- Water balance should be correct
- Modelling for the *right reason*

Free draining conditions

- Conventional approach
- Large unsaturated zone ($Z_r = 30\text{m}$)
- No influence of groundwater table



Dynamic water tables

- Unsaturated zone from 5 – 30m
- Based on max. elevation and stream elevation
- Drainage depends on slopes
- Influence of groundwater tables



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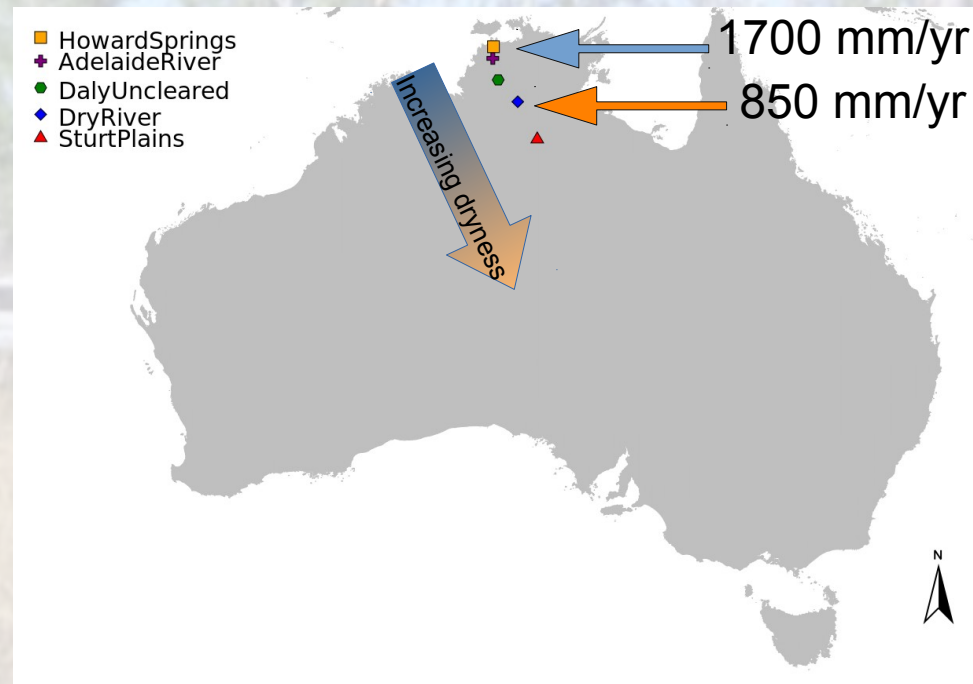
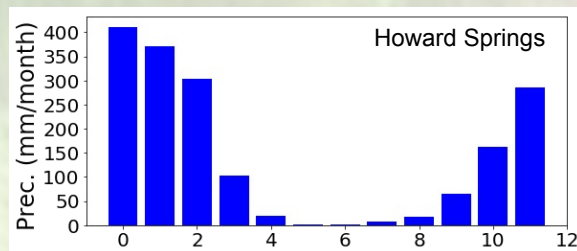
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NORTH AUSTRALIAN TROPICAL TRANSECT

- Mean annual rainfall: 500-1800 mm
- Pronounced wet season: Nov-Feb
- Evergreen trees + seasonal grass
- Evaporation and CO₂ fluxes >10 years

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RENKU 連句

Renku is an environment for collaborative, reproducible data science

Concepts

- Tracking of scientific steps to create data lineage, i.e. a knowledge graph
- Updating of out-dated results
- Tool to re-use or re-run analyses
- Sharing of analyses

Features

Renku is based on :

- Gitlab
- JupyterHub
- Kubernetes
- Keycloak
- Common Workflow Language

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[Go to RENKU website →](#)

RENKU 連句

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Renku run makes sure the workflow is tracked

Renku run

Renku status shows if all outputs are generated from the most recent input data

Renku status

Renku update re-runs everything to have all outputs based on the most recent inputs

Renku update

Renku log shows how a file is generated. In other words, it shows the knowledge graph.

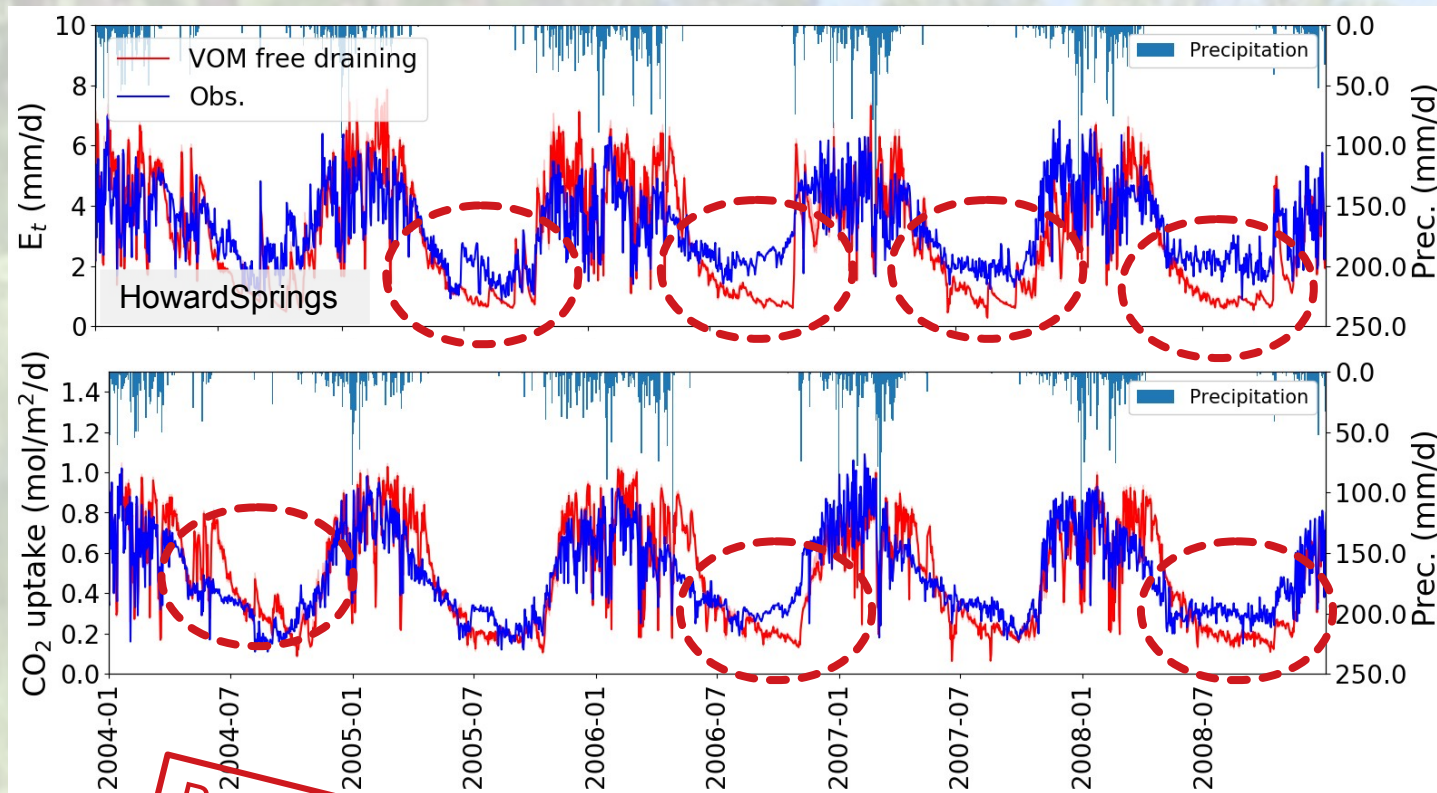
Renku log

Show knowledge graph

Go to workflow of this experiment→

INITIAL RESULTS

Reasonable match observed and modelled fluxes



But there is room
for improvement...

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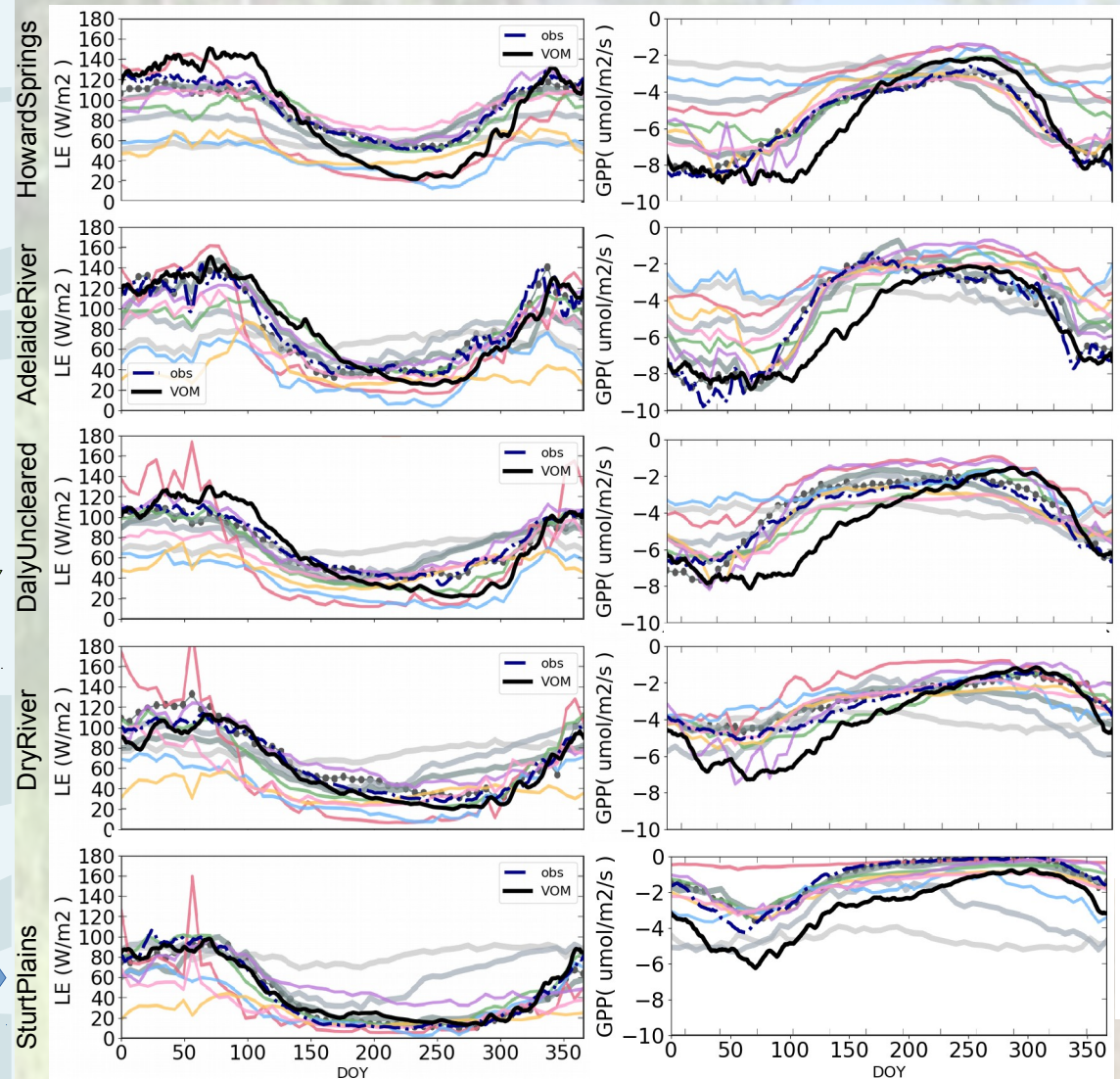
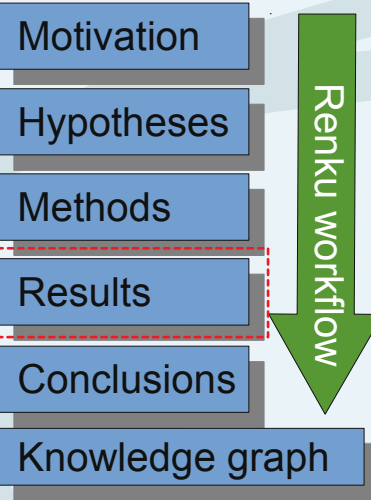
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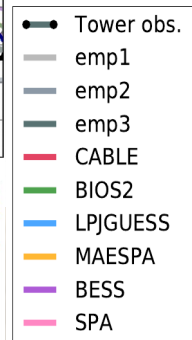
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MODEL COMPARISON



- Similar results with less data



Graph modified from:
Whitley et al. (2015): Biogeosciences 13

MODEL COMPARISON

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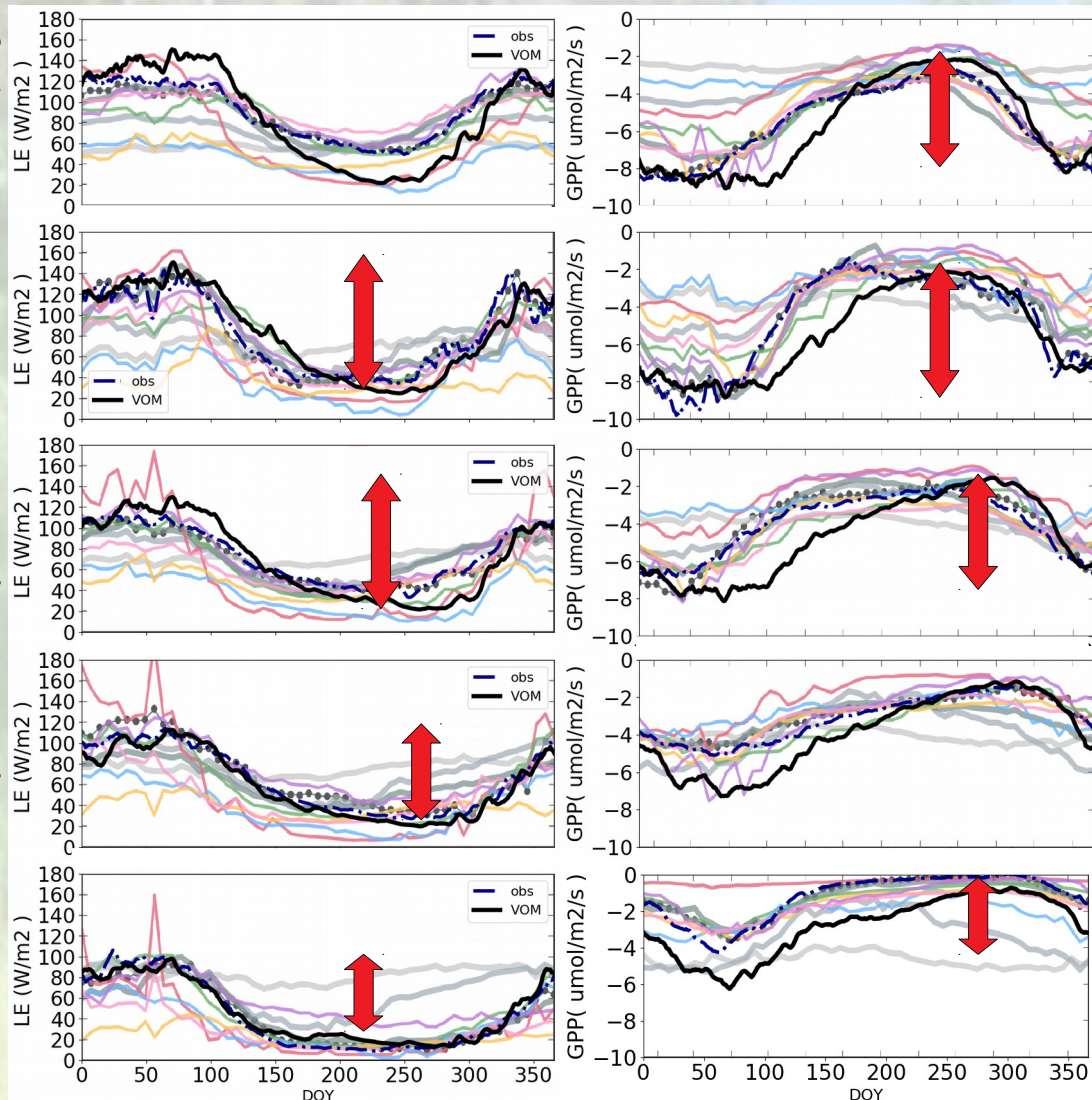
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HowardSprings
AdelaideRiver
DailyUncleared
DryRiver
SturtPlains



- Similar results with less data
- Correct seasonal amplitude in most cases

● Tower obs.
— emp1
— emp2
— emp3
— CABLE
— BIOS2
— LPJGUESS
— MAESPA
— BESS
— SPA

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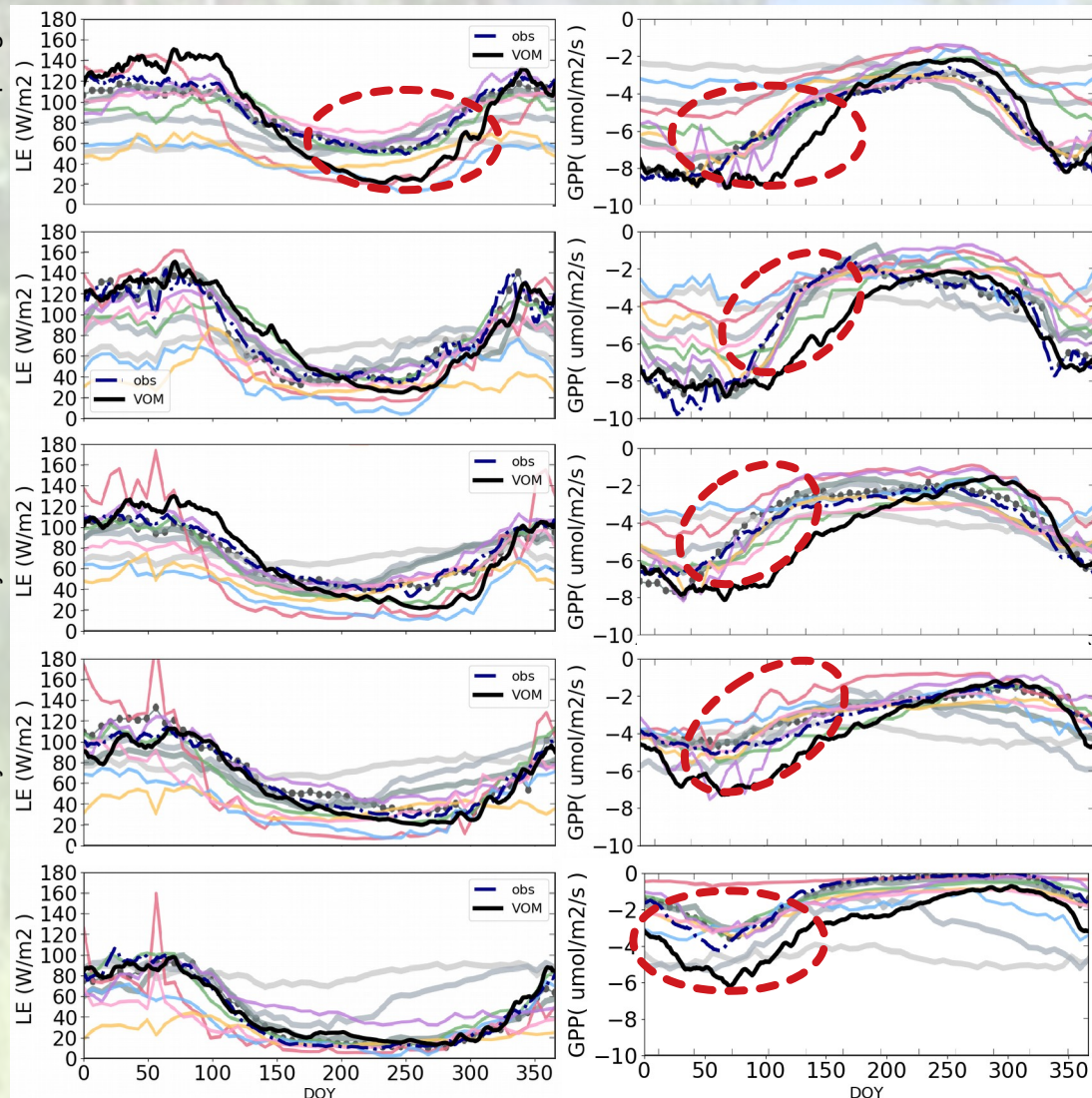
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- Similar results with less data
- Correct seasonal amplitude in most cases
- Improvements still needed:
 - Assimilation too high
 - Especially for drier sites

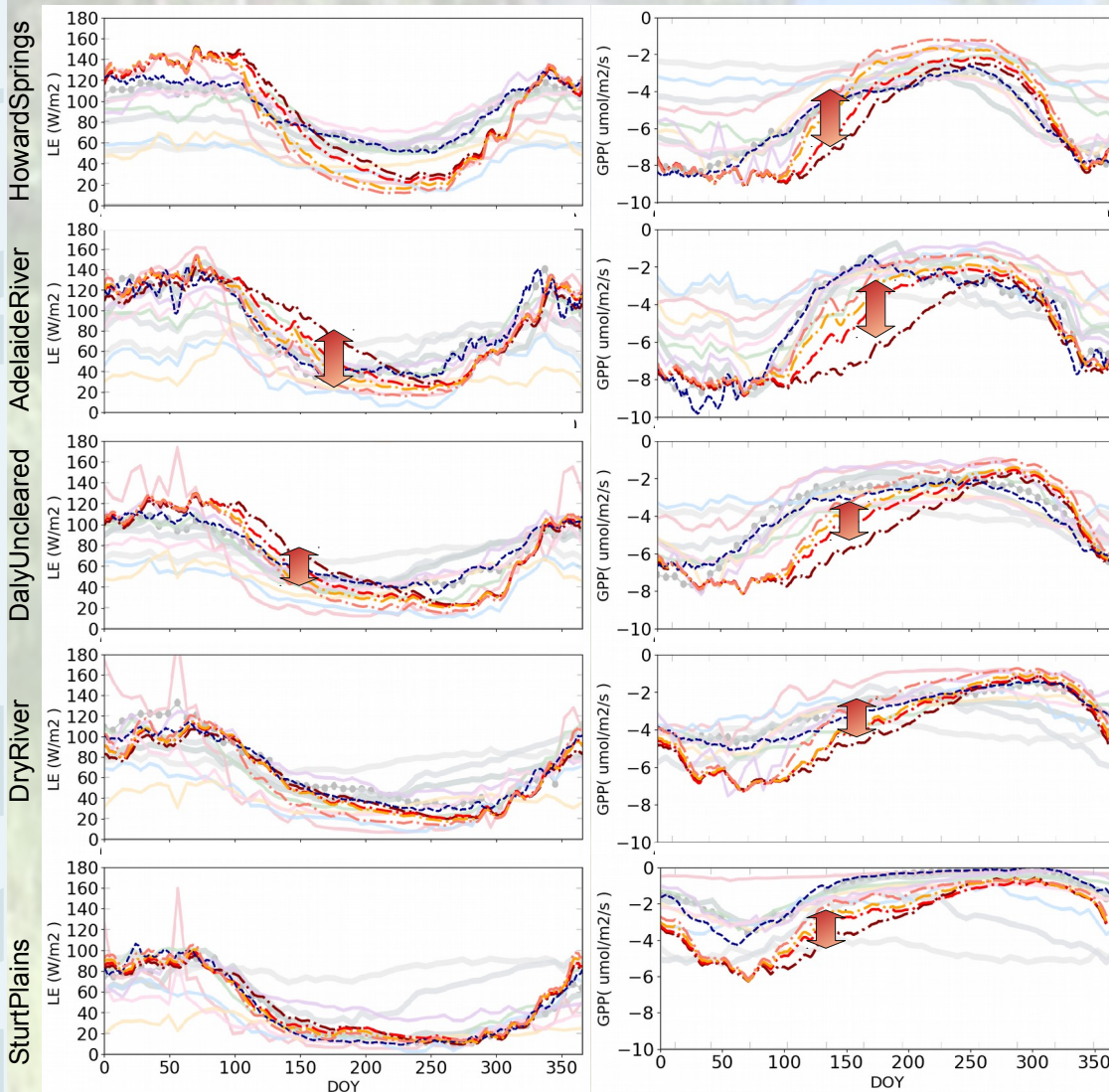
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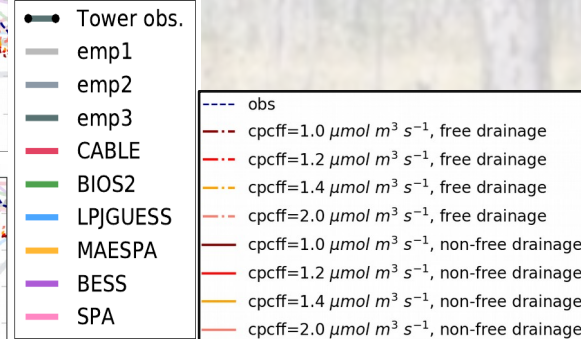


Costfactor for water transport is unknown, and may need refinement

[Read more ...](#)

Higher costfactor:

- Improves seasonal signal
- Especially for wetter areas



Graph modified from:
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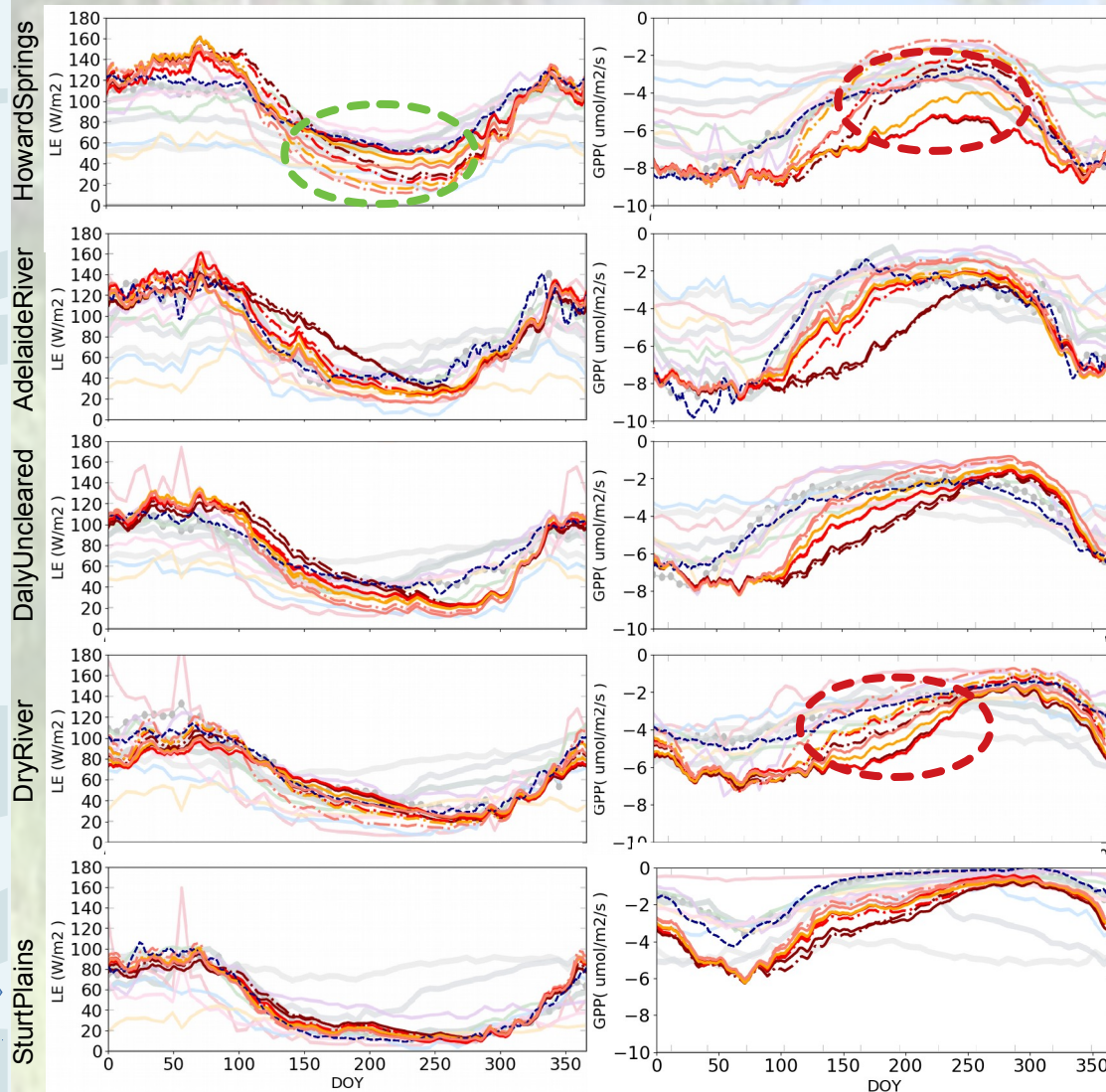
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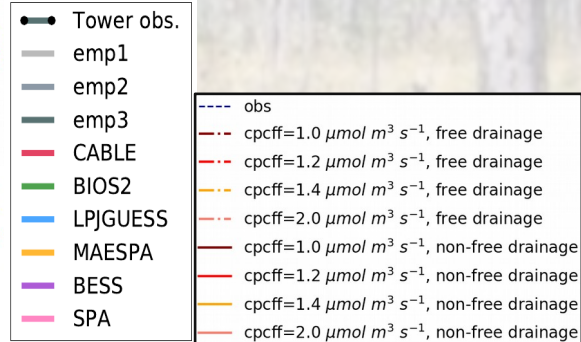
MODEL COMPARISON



Hydrology is parameterized for free draining and non-free draining conditions

- Some improvements
- Some deteriorations
- Mostly similar results

Uniqueness of place?
Robust model?



Graph modified from:
Whitley et al. (2015): Biogeosciences 13

IMPROVING HYDROLOGY AND CARBON COSTS

Hydrology differs strongly, but has hardly any influence on fluxes

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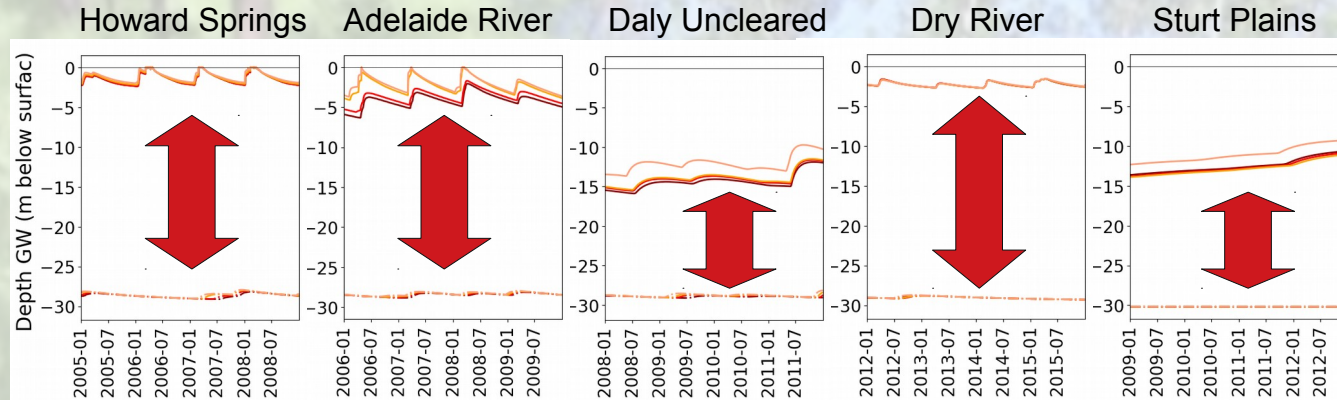
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Dynamic water table

Free drainage

- cpcff=1.0 $\mu\text{mol m}^3 \text{s}^{-1}$, free drainage
- cpcff=1.2 $\mu\text{mol m}^3 \text{s}^{-1}$, free drainage
- cpcff=1.4 $\mu\text{mol m}^3 \text{s}^{-1}$, free drainage
- cpcff=2.0 $\mu\text{mol m}^3 \text{s}^{-1}$, free drainage
- cpcff=1.0 $\mu\text{mol m}^3 \text{s}^{-1}$, dynamic water table
- cpcff=1.2 $\mu\text{mol m}^3 \text{s}^{-1}$, dynamic water table
- cpcff=1.4 $\mu\text{mol m}^3 \text{s}^{-1}$, dynamic water table
- cpcff=2.0 $\mu\text{mol m}^3 \text{s}^{-1}$, dynamic water table

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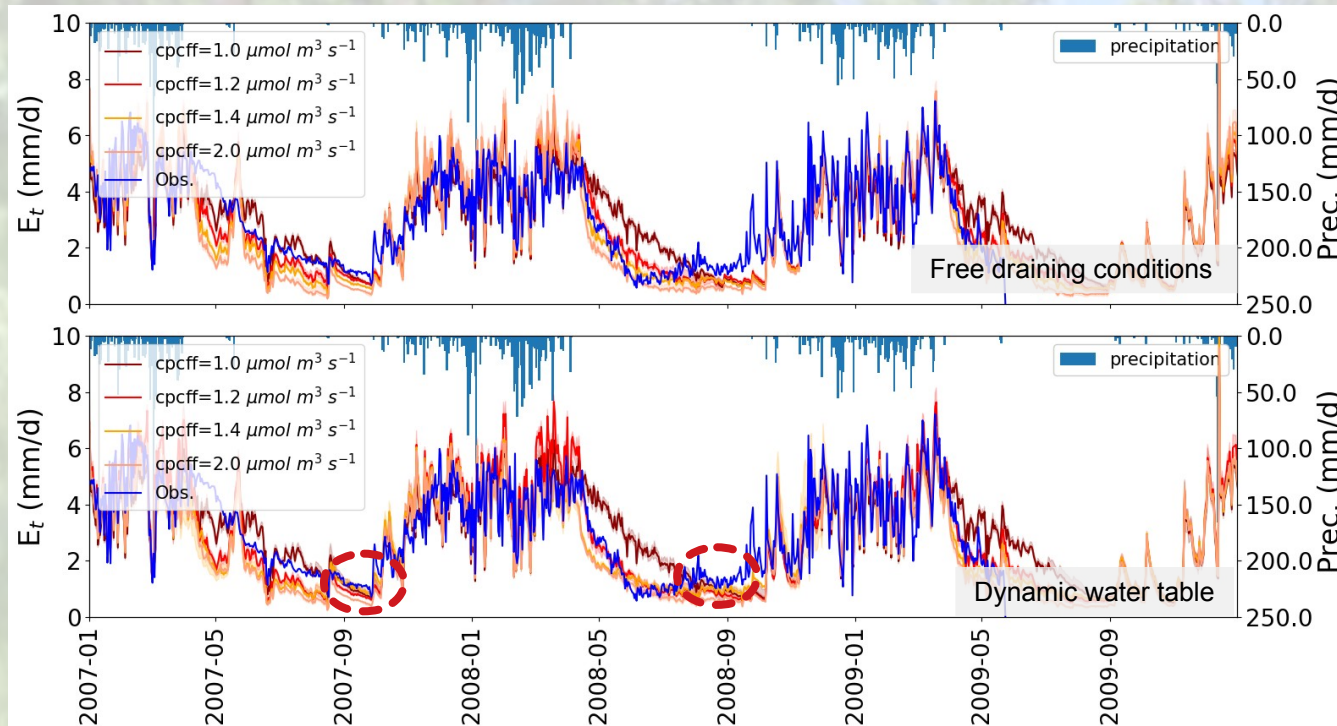
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Improvements by the hydrology:

- Only small improvements at end of dry season

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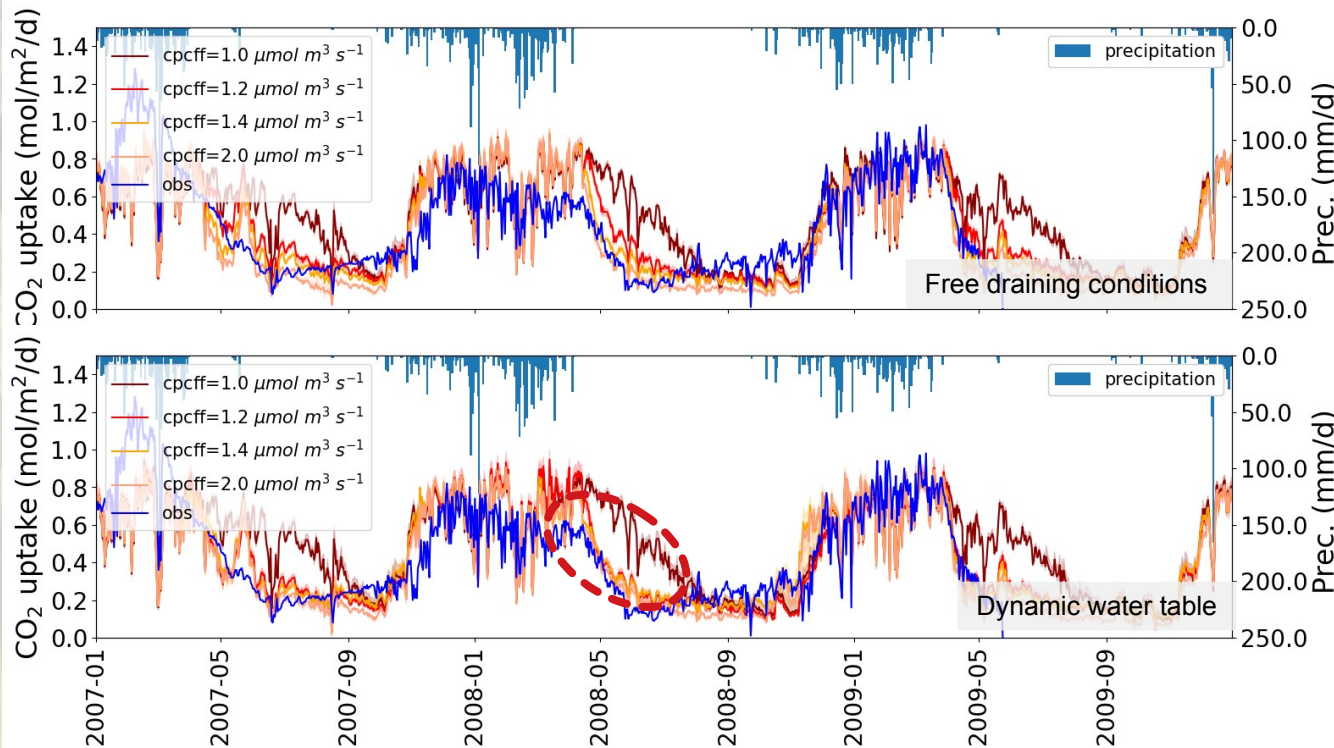
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- Higher values of the water transport cost parameter improve assimilation
- Only small differences for dynamic water tables

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PERFORMANCES

- Assimilation increasingly over-estimated for drier areas
- Evaporation still okay

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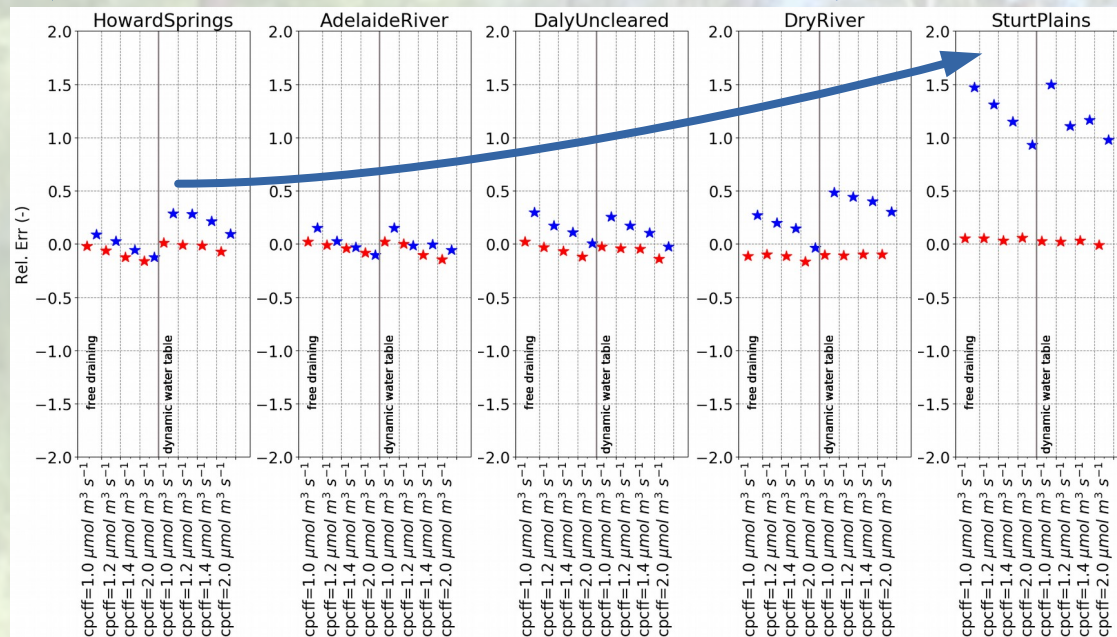
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Increasing dryness



★ evaporation
★ assimilation

See more ...

Rel. Err. Annual Means

Rel. Err. Mean Dry Season

Rel. Err. Mean Wet Season

Kling-Gupta Efficiency

VEGETATION DYNAMICS

- Temporal signal largely reproduced
- Timing improves for higher cost factor
- Higher minimum cover for non-freely draining conditions

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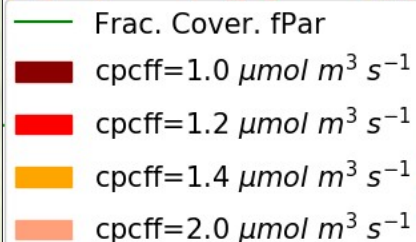
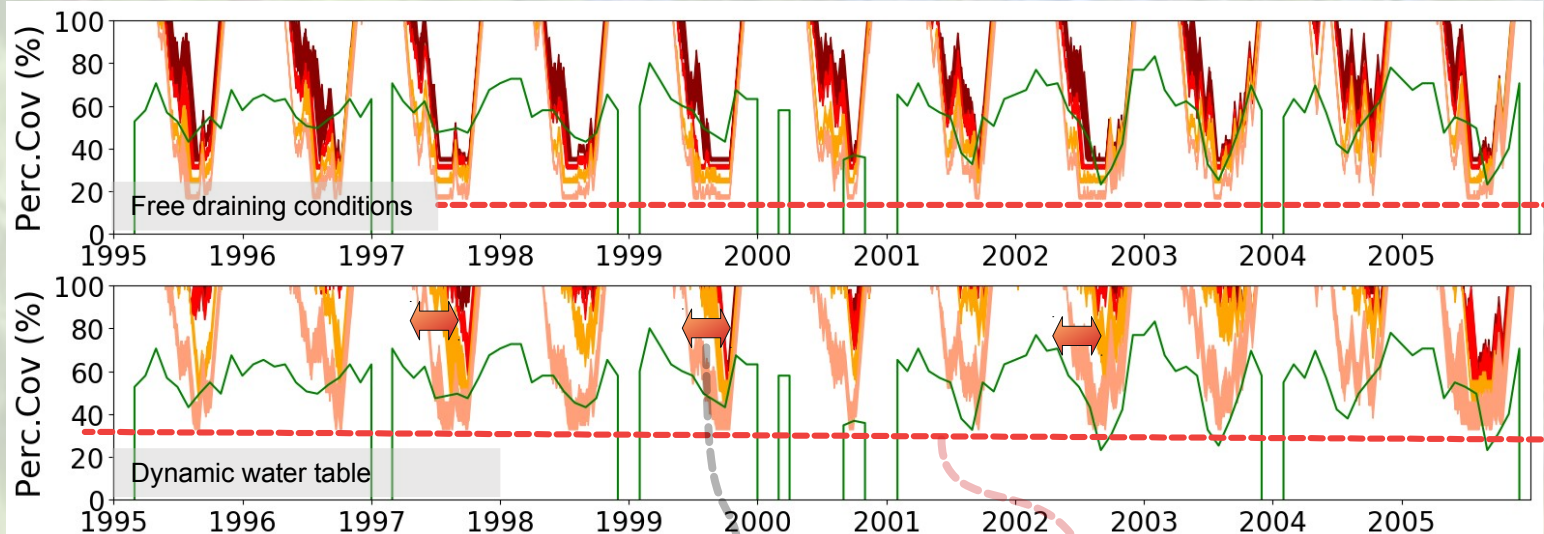
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Better
timing

Higher
minimum

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CONCLUSIONS

- Optimizing for the **Net Carbon Profit** leads to similar vegetation dynamics as observed
- Similar performances as conventional models, with **less data**
- Not a clear influence of the **hydrological formulation**
- **Cost factor** for water transport needs to be refined
- Reproducible science with **Renku!** →

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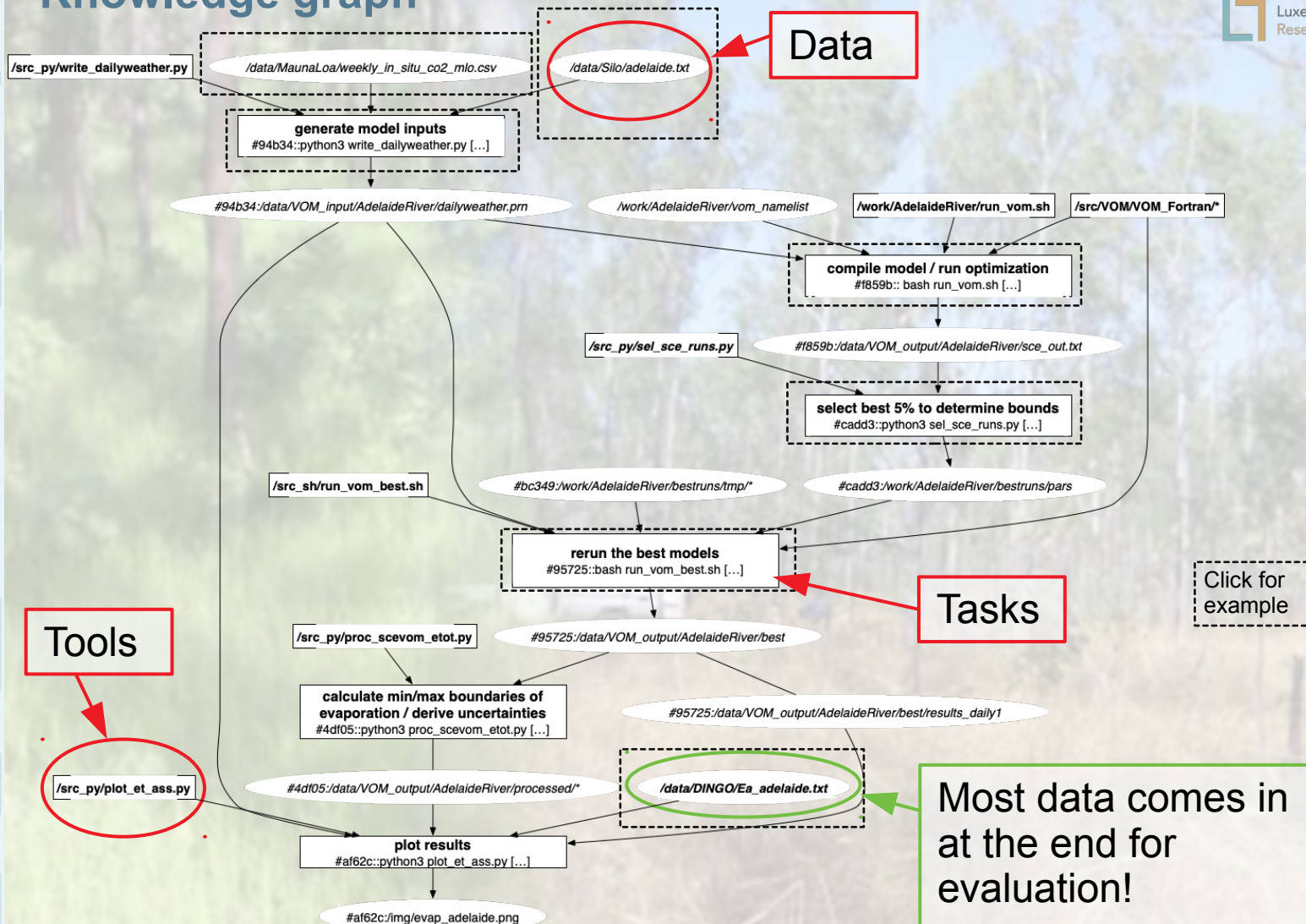
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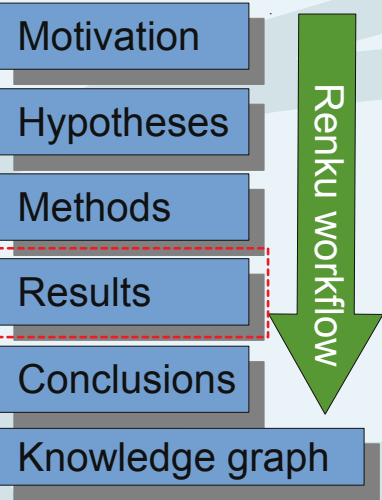
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CARBON COSTS



- **Root respiration** is a function of respiration rate (c_{Rr} , $\text{mol s}^{-1} \text{m}^{-3}$), fine root radius (r_r , m), root surface area per unit ground area (S_{Ar} , $\text{m}^2 \text{m}^{-2}$):

$$R_r = c_{Rr} \left(\frac{r_r}{2} S_{Ar} \right)$$

- **Leaf area costs** are a function of vegetated fraction (M_A , -), clumped leaf area index (2.5, -), average carbon investment ($0.22 \mu\text{mol s}^{-1} \text{m}^{-2}$):

$$R_f = 2.5 \times 0.22 \mu\text{mol s}^{-1} \text{m}^{-2} M_A$$

- **Water transport costs** are a function of rooting depth (y_r), vegetated fraction (M_A , -) and a cost factor ($cpcff$, $\text{mol s}^{-1} \text{m}^{-3}$):

$$R_v = cpcff * M_A y_r$$

The cost factor $cpcff$ is rather unknown, and may need refinement.

HYDROLOGY AND CARBON COSTS

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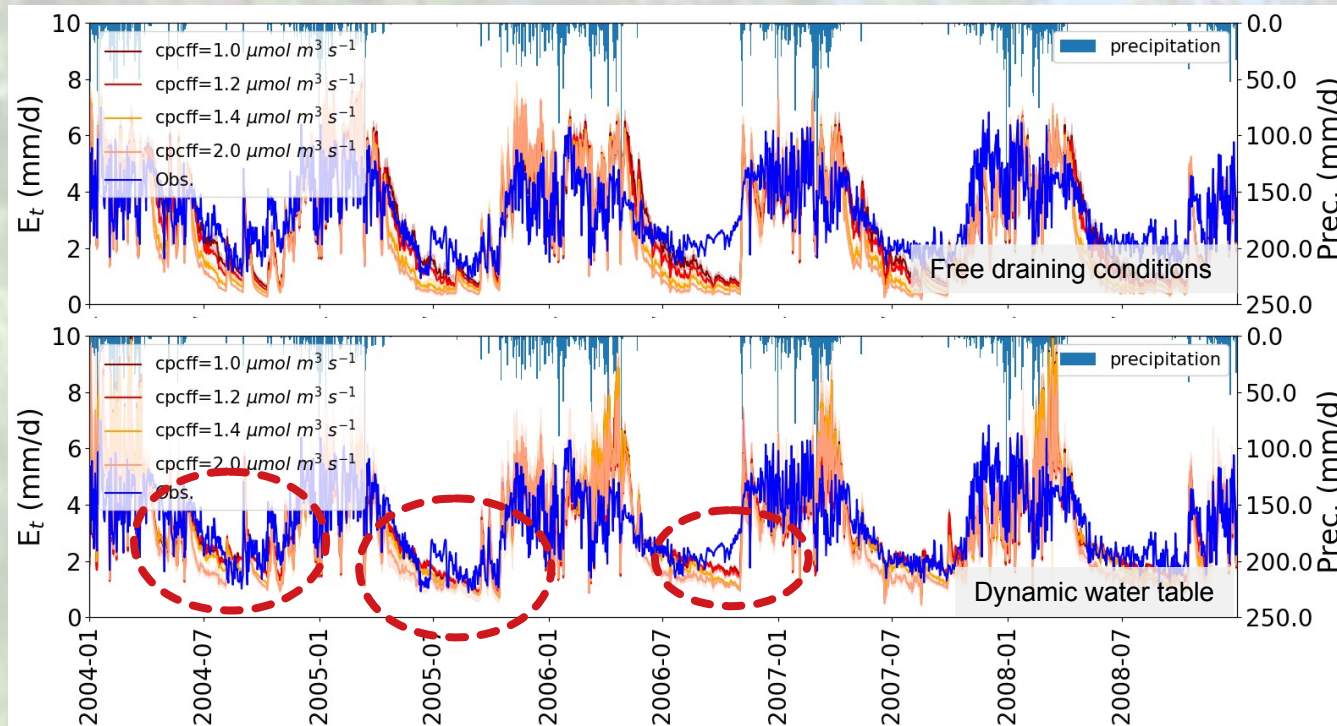
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Improvements by the hydrology:

- Dynamic groundwater tables improve evaporation at end of dry season
- Still just small improvements

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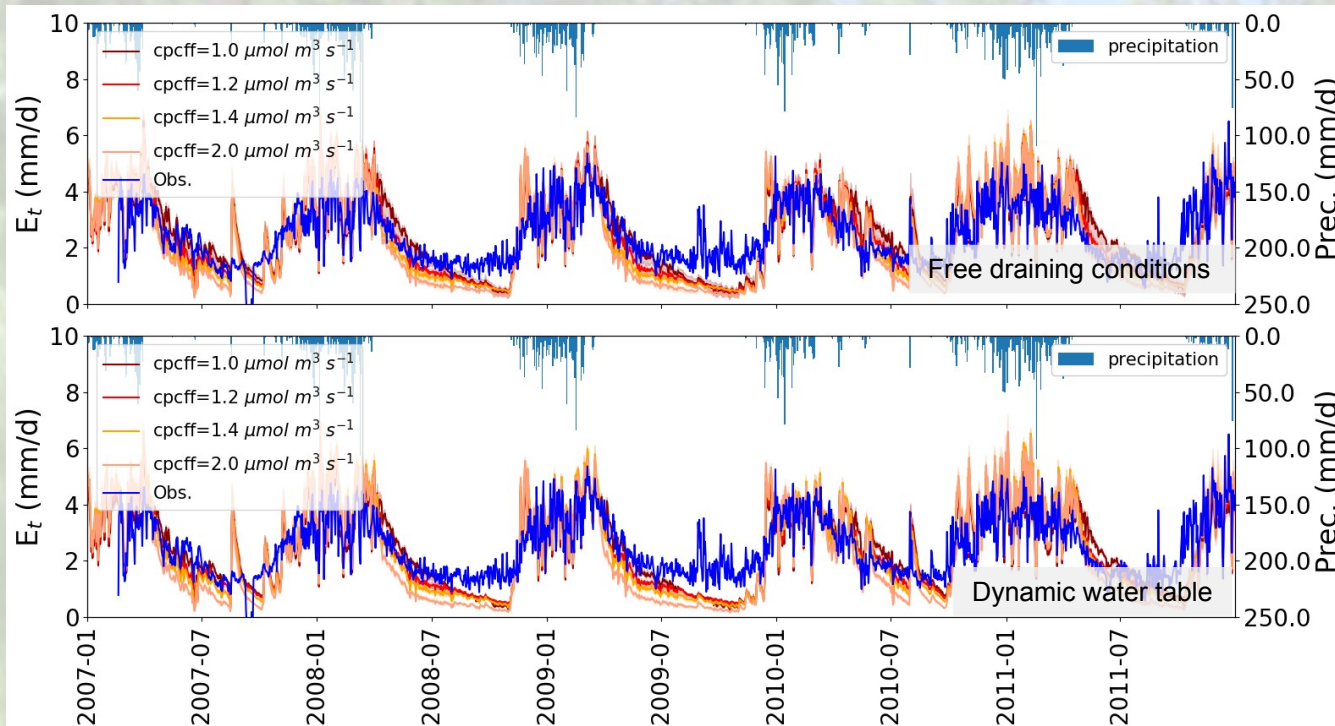
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Improvements by the hydrology:

- Dynamic groundwater tables do not show a strong improvement

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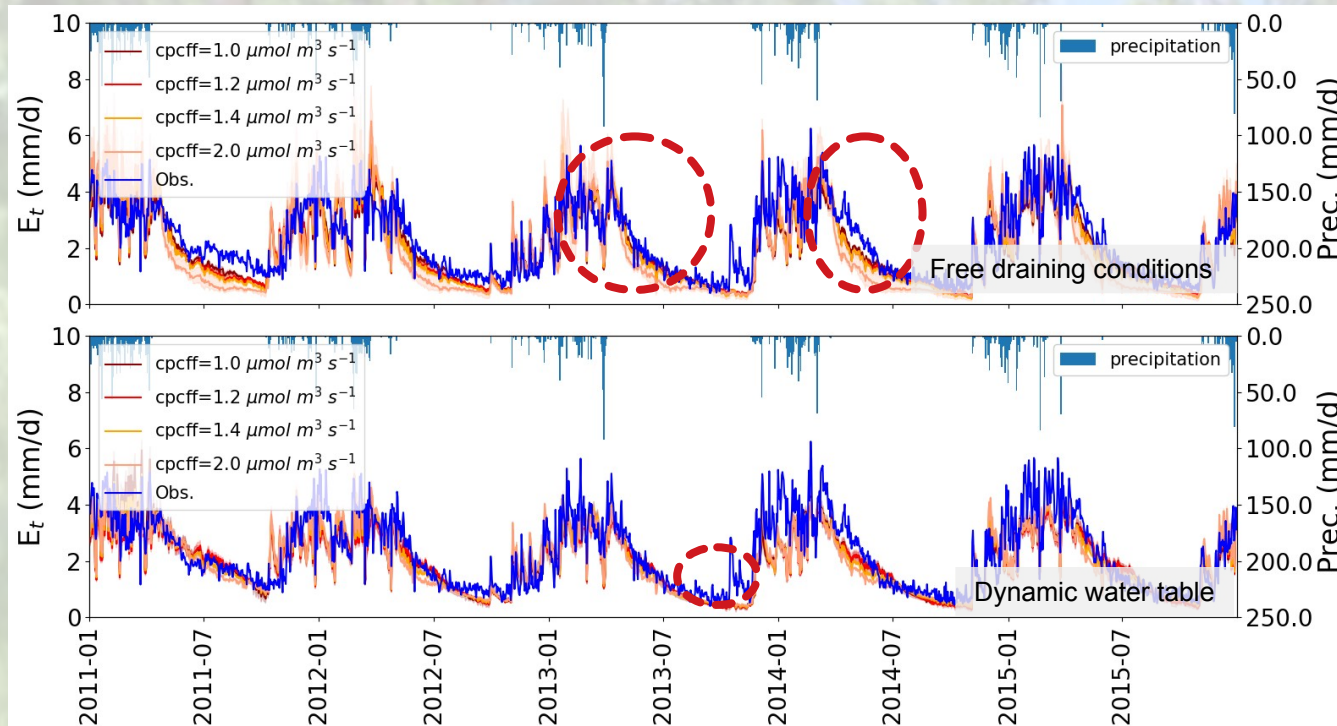
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- Higher values of the water transport cost parameter improve assimilation
- Dynamic groundwater tables do not help for assimilation

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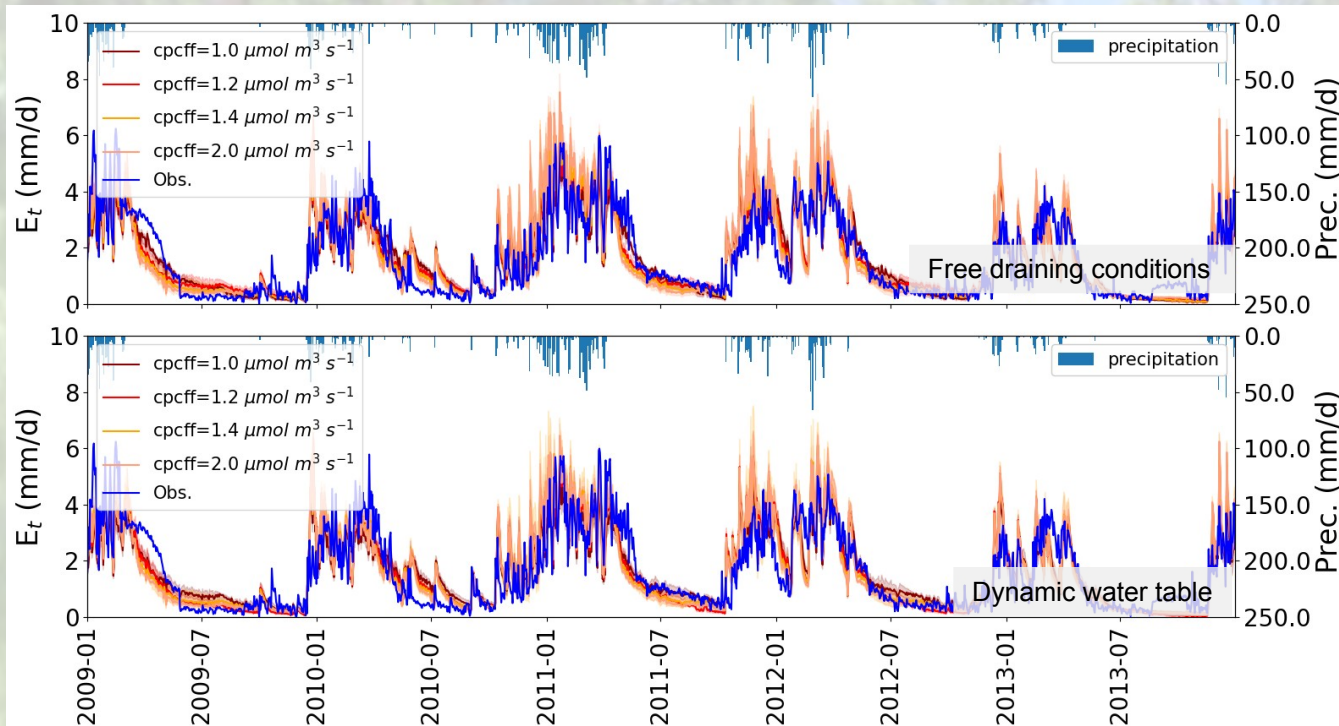
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Improvements by the hydrology:

- Dynamic groundwater tables do not show strong improvements

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HYDROLOGY AND CARBON COSTS

Motivation

Hypotheses

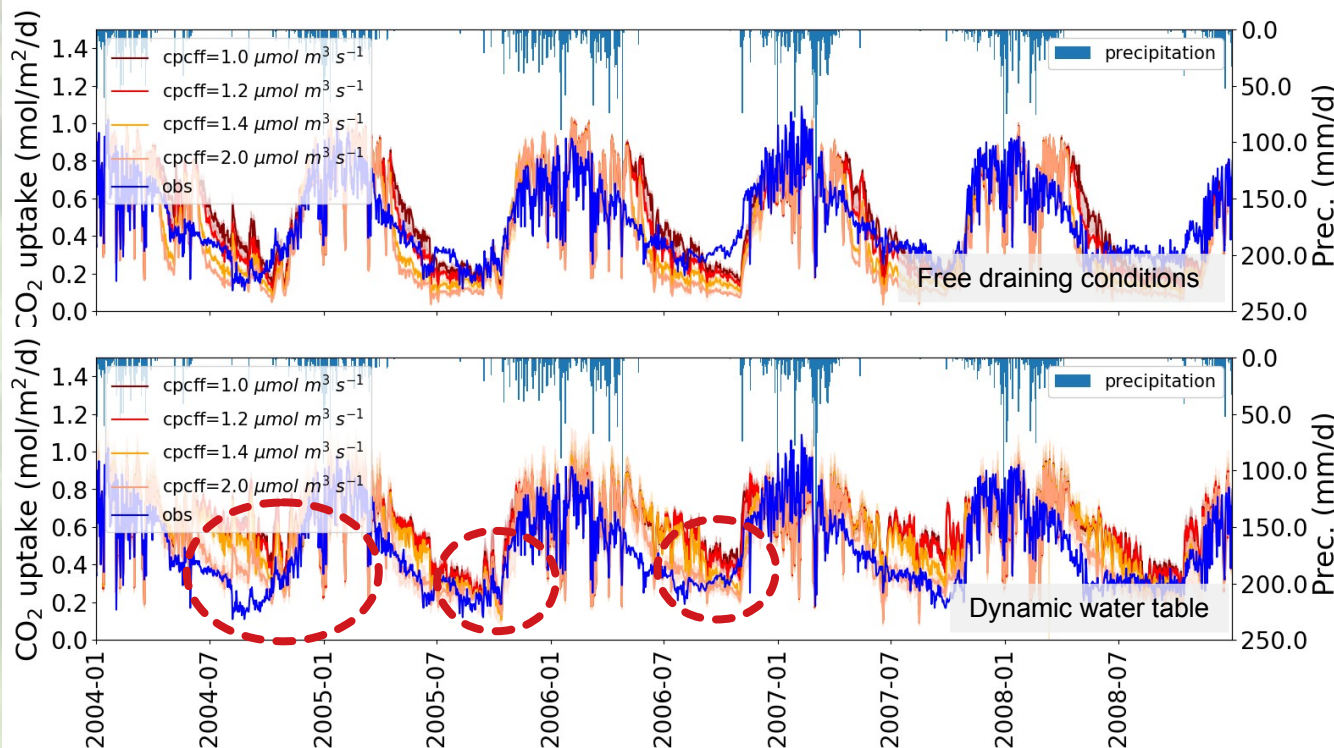
Methods

Results

Conclusions

Knowledge graph

Renku workflow



- Higher values of the water transport cost parameter improve assimilation
- Dynamic groundwater tables do not help for assimilation

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IMPROVING HYDROLOGY AND CARBON COSTS

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Hypotheses

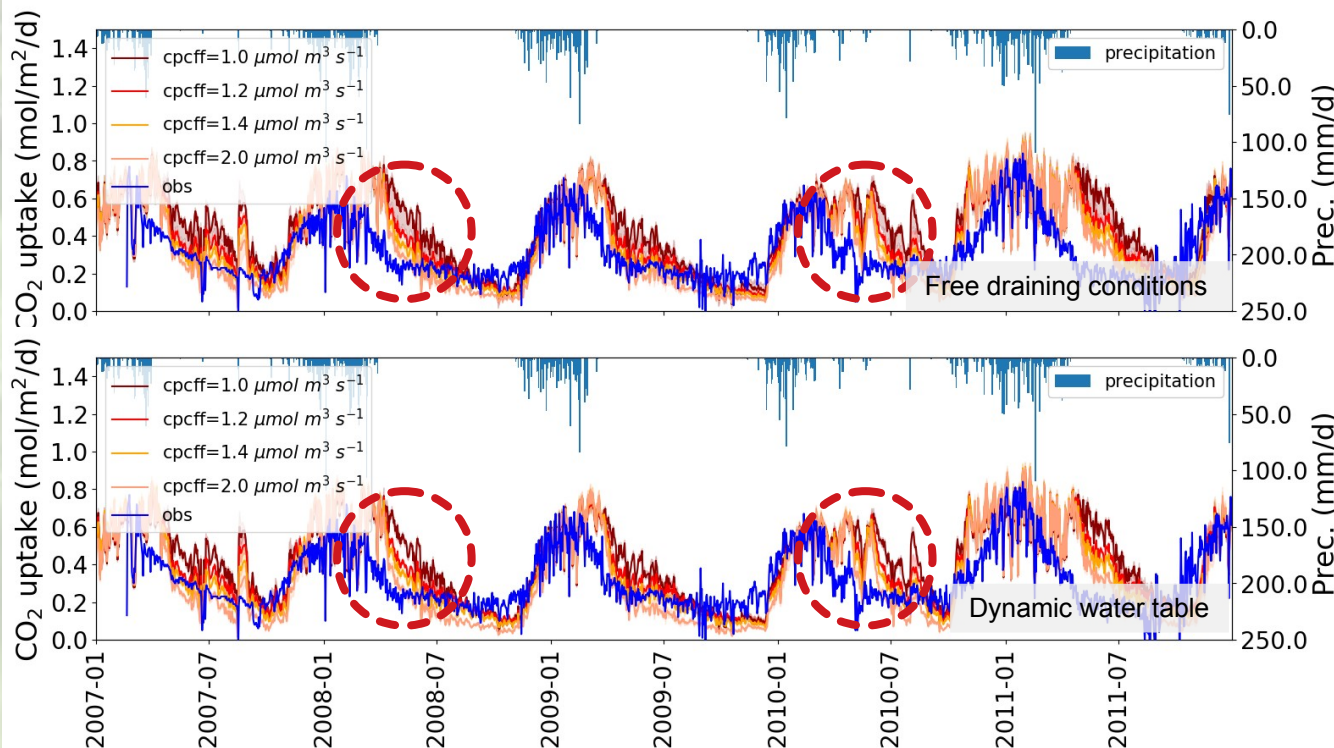
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Hypotheses

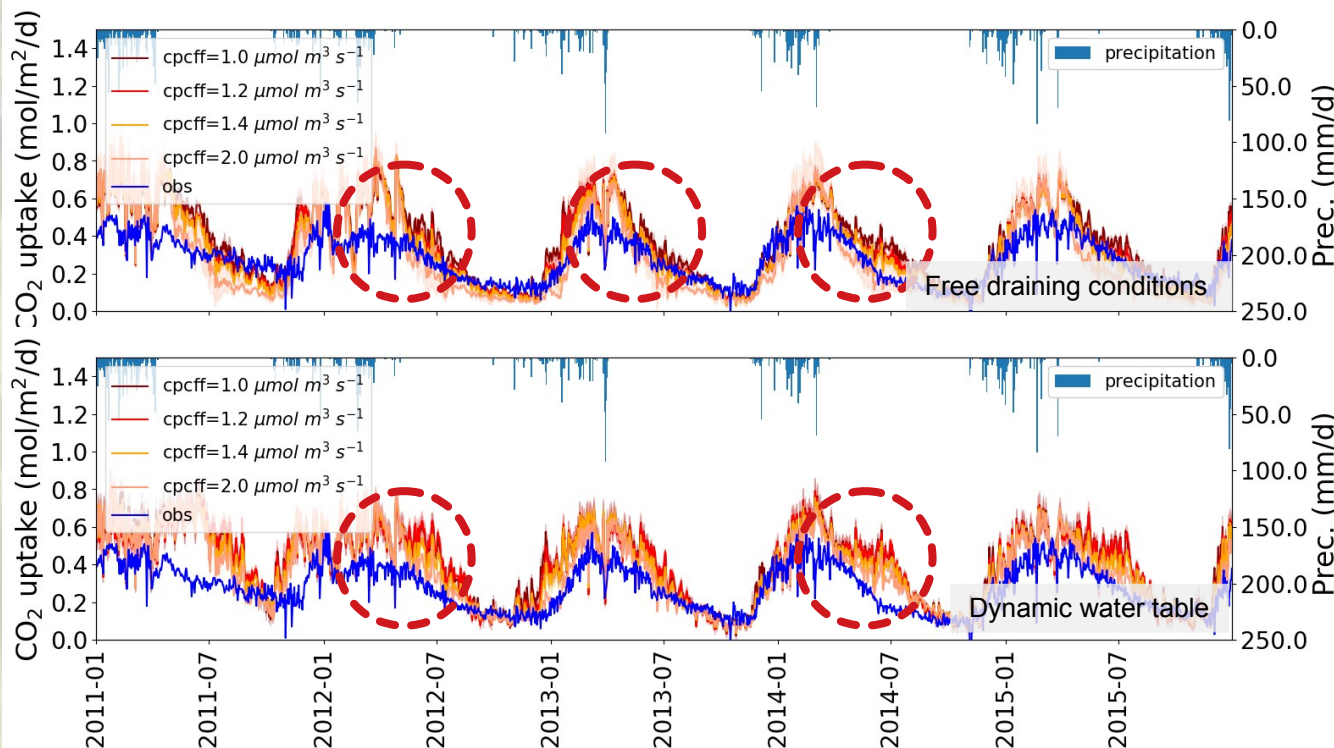
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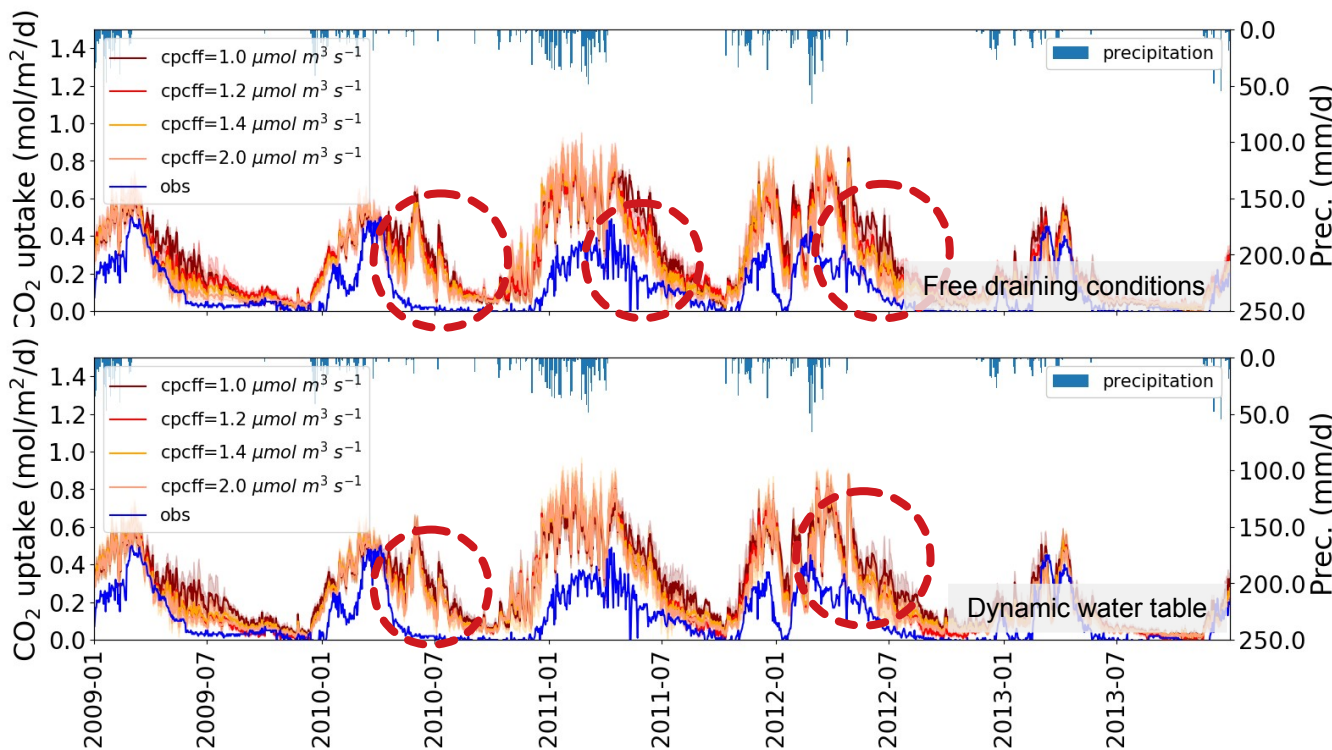
Methods

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- Dynamic groundwater tables do not help for assimilation

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PERFORMANCES

- Assimilation increasingly over-estimated for drier areas
- Evaporation still okay

Motivation

Hypotheses

Methods

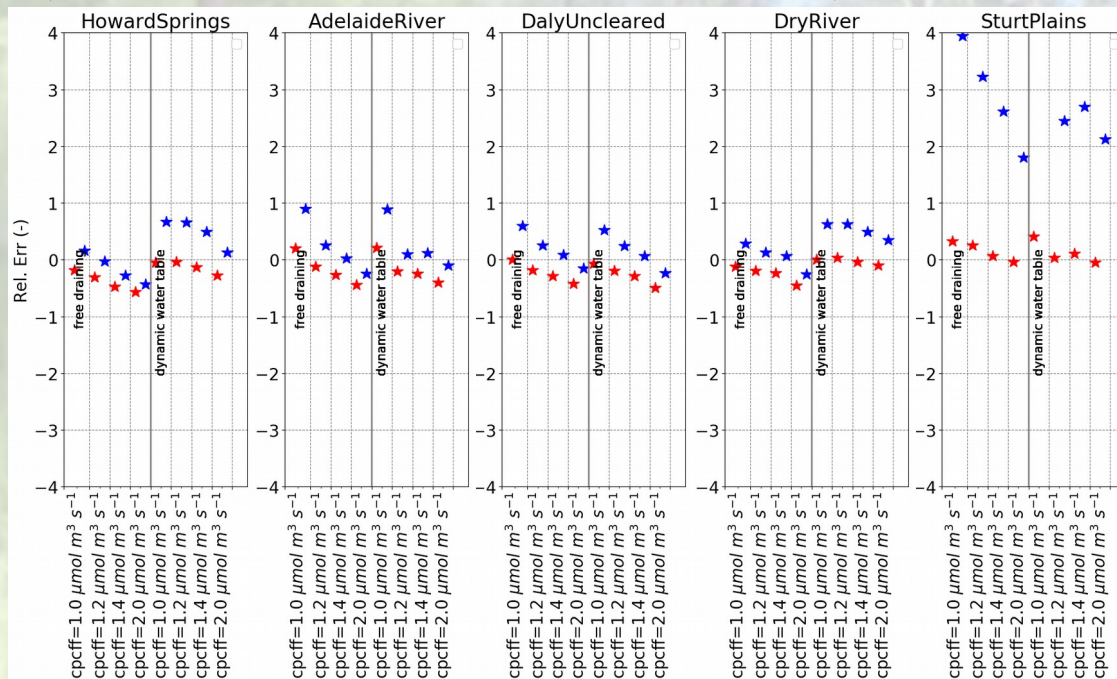
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Increasing dryness



See more ...

Rel. Err. Annual Means

Rel. Err. Mean Dry Season

Rel. Err. Mean Wet Season

Kling-Gupta Efficiency

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- Assimilation increasingly over-estimated for drier areas
- Evaporation still okay

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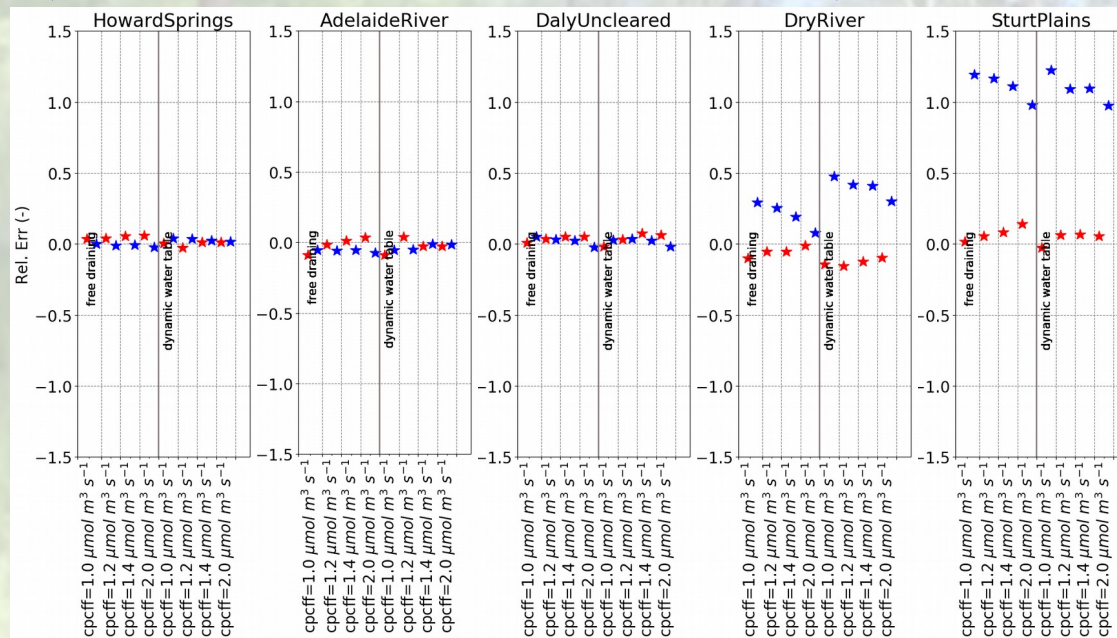
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Increasing dryness



- ★ evaporation
- ★ assimilation

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Rel. Err. Annual Means

Rel. Err. Mean Dry Season

Rel. Err. Mean Wet Season

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PERFORMANCES

- Assimilation increasingly over-estimated for drier areas
- Evaporation still okay

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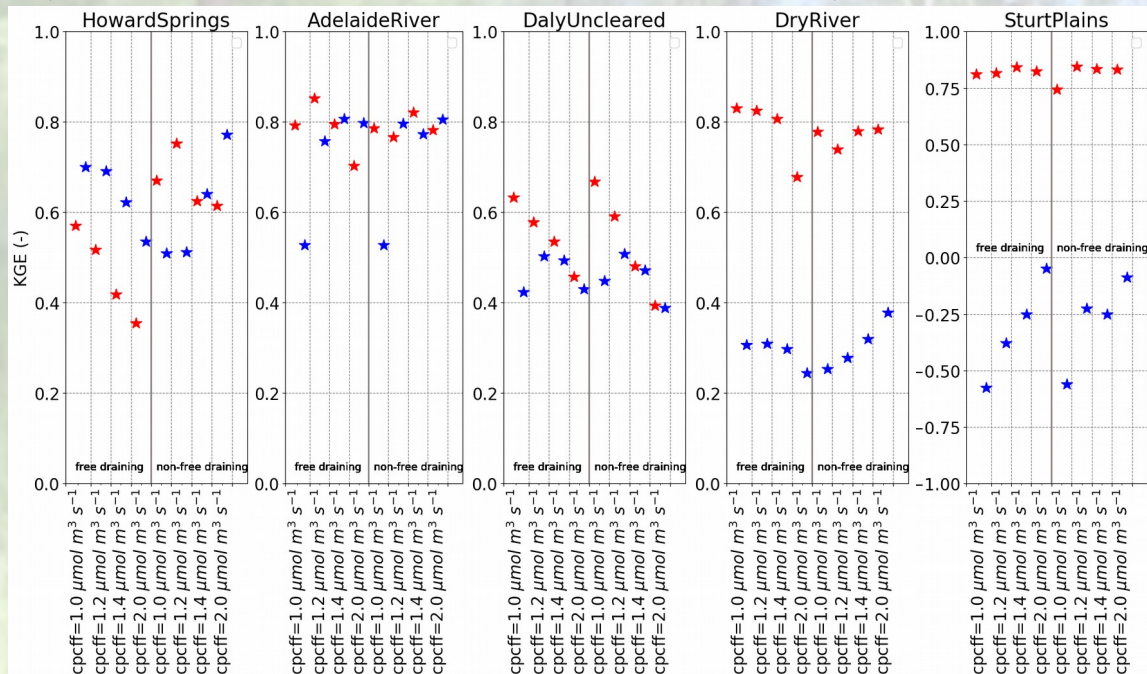
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Increasing dryness



★ evaporation
★ assimilation

See more ...

Rel. Err. Annual Means

Rel. Err. Mean Dry Season

Rel. Err. Mean Wet Season

Kling-Gupta Efficiency

VEGETATION DYNAMICS

- Temporal signal largely reproduced
- Timing improves for higher cost factor
- Similar minimum cover for dynamic water tables

Renku workflow

Motivation

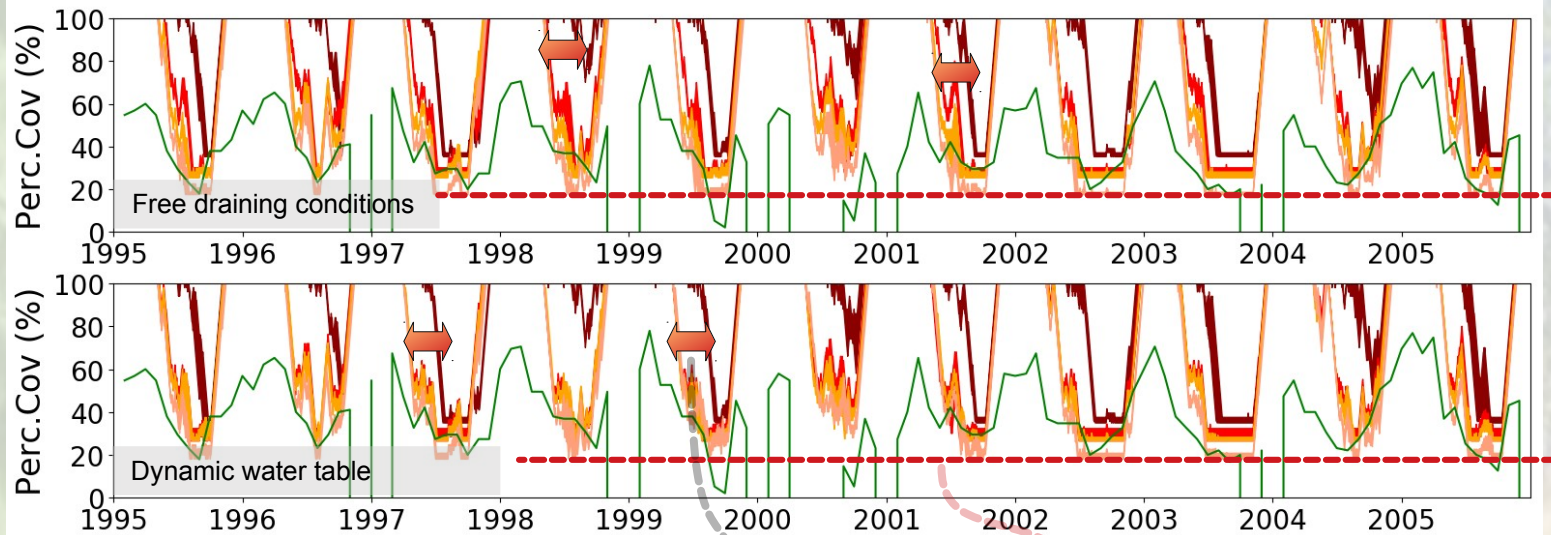
Hypotheses

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— Frac. Cover. fPar

■ cpcff=1.0 $\mu\text{mol m}^3 \text{s}^{-1}$

■ cpcff=1.2 $\mu\text{mol m}^3 \text{s}^{-1}$

■ cpcff=1.4 $\mu\text{mol m}^3 \text{s}^{-1}$

■ cpcff=2.0 $\mu\text{mol m}^3 \text{s}^{-1}$

Better
timing

Similar
minimum

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VEGETATION DYNAMICS

- Temporal signal largely reproduced
- Timing improves for higher cost factor
- Similar minimum cover for dynamic water tables

Renku workflow

Motivation

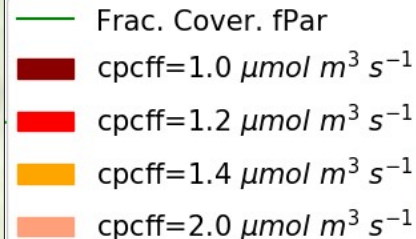
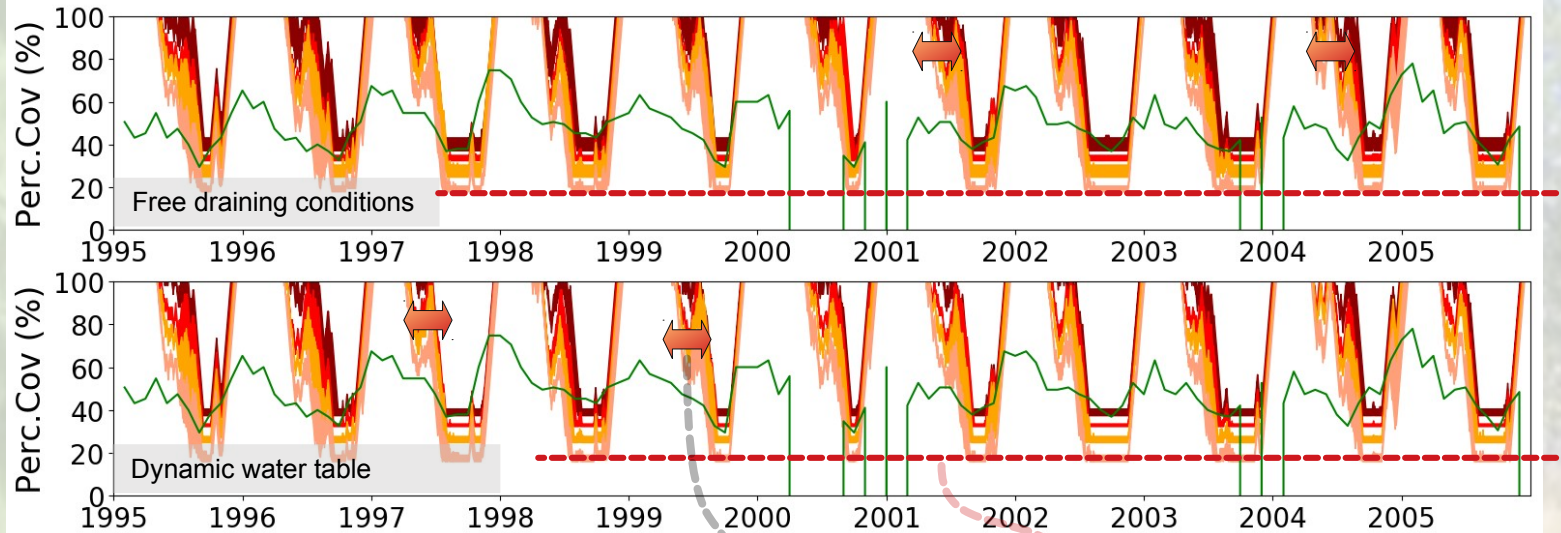
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Better
timing

Similar
minimum

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VEGETATION DYNAMICS

- Temporal signal largely reproduced
- Timing improves for higher cost factor
- Higher minimum cover for non-freely draining conditions

Renku workflow

Motivation

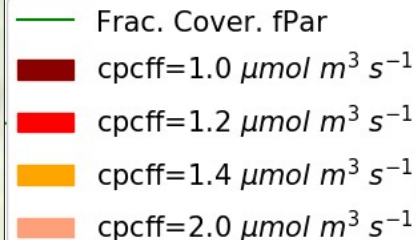
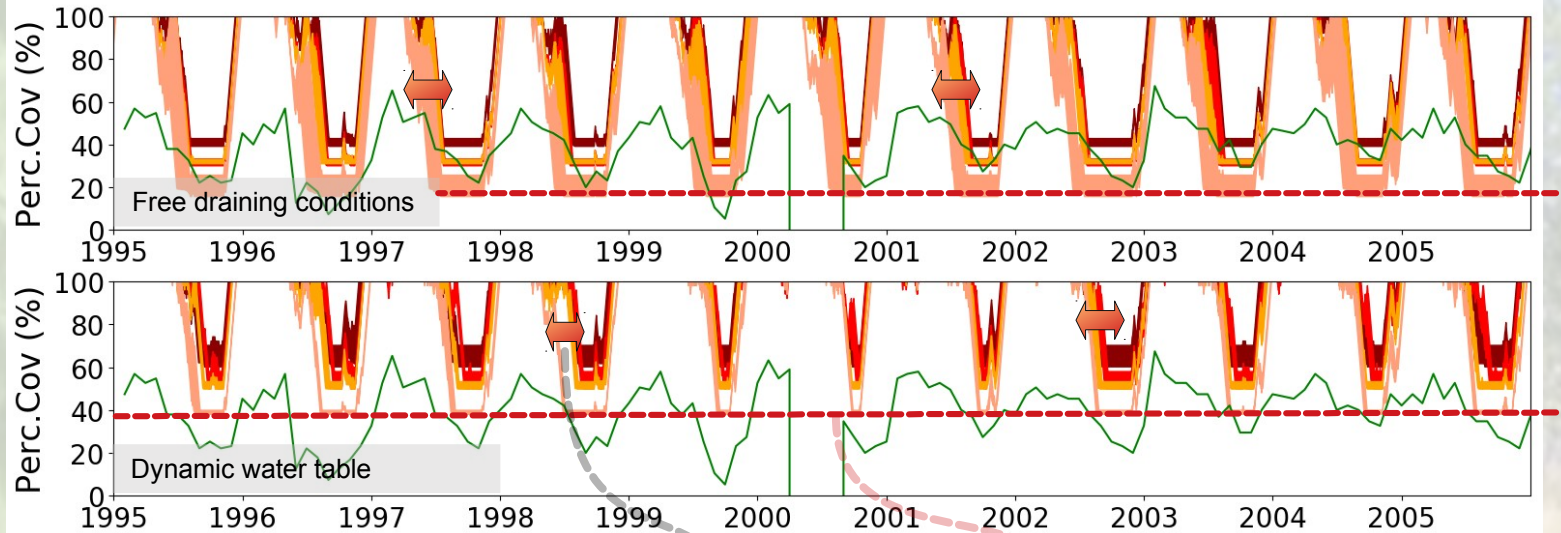
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Better
timing

Higher
minimum

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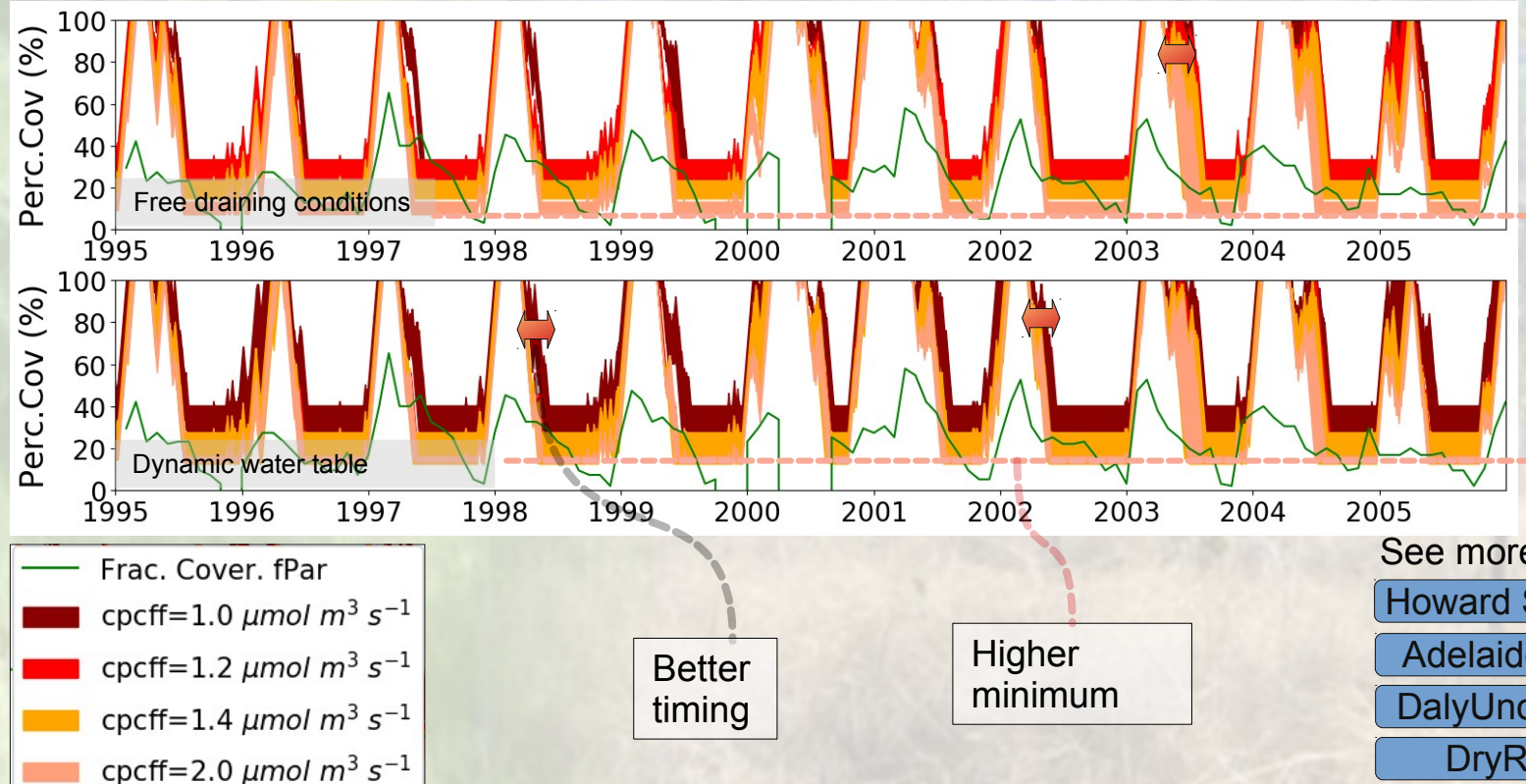
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VEGETATION DYNAMICS

- Temporal signal largely reproduced
- Timing improves for higher cost factor
- Higher minimum cover for non-freely draining conditions



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```
remko@ERIN-RNI-30243: ~/renku_egu
File Edit View Search Terminal Help
remko@ERIN-RNI-30243:~/renku_egu$ renku run bash run_vom.sh ../../data/VOM_input/HowardSprin
gs/dailyweather.prn vom_namelist ../../src/VOM/VOM_Fortran/VOM-code/*
```

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Renku log shows how a file is generated. In other words, it shows the knowledge graph.

Renku log

Show knowledge graph


```
remko@ERIN-RNI-30243: ~/renku_egu
File Edit View Search Terminal Help

remko@ERIN-RNI-30243:~/renku_egu$ renku status
On branch master
All files were generated from the latest inputs.
remko@ERIN-RNI-30243:~/renku_egu$
```

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RENKU 連句

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remko@ERIN-RNI-30243: ~/renku_egu

File Edit View Search Terminal Help

```
remko@ERIN-RNI-30243:~/renku_egu$ renku update
Resolved '.renku/workflow/21b601c544df4dc8872173d045c3d8d6.cwl' to 'file:///home
/remko/renku_egu/.renku/workflow/21b601c544df4dc8872173d045c3d8d6.cwl'
[workflow ] start
[workflow ] starting step step_1
[step step_1] start
[job step_1] /tmp/tmp4qpm8jfl$ cp \
    /tmp/tmptjlyrl2o/stg2e3a4e46-0fc8-4bc9-af40-55831c9b59ae/evi_adelaide.txt \
    pc_mod.txt
[job step_1] completed success
[step step_1] completed success
[workflow ] completed success
remko@ERIN-RNI-30243:~/renku_egu$
```

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Go to workflow of this experiment→

Renku run makes sure the workflow is tracked

Renku run

```
remko@ERIN-RNI-30243: ~/renku_egu
File Edit View Search Terminal Help
remko@ERIN-RNI-30243:~$ cd renku_egu/
remko@ERIN-RNI-30243:~/renku_egu$ renku log --format dot evap_adelaide.png | dot
-Tpng > ../../../../knowledge_graphs/evap_adelaide.png
```

other words, it shows the knowledge graph.

Show knowledge graph

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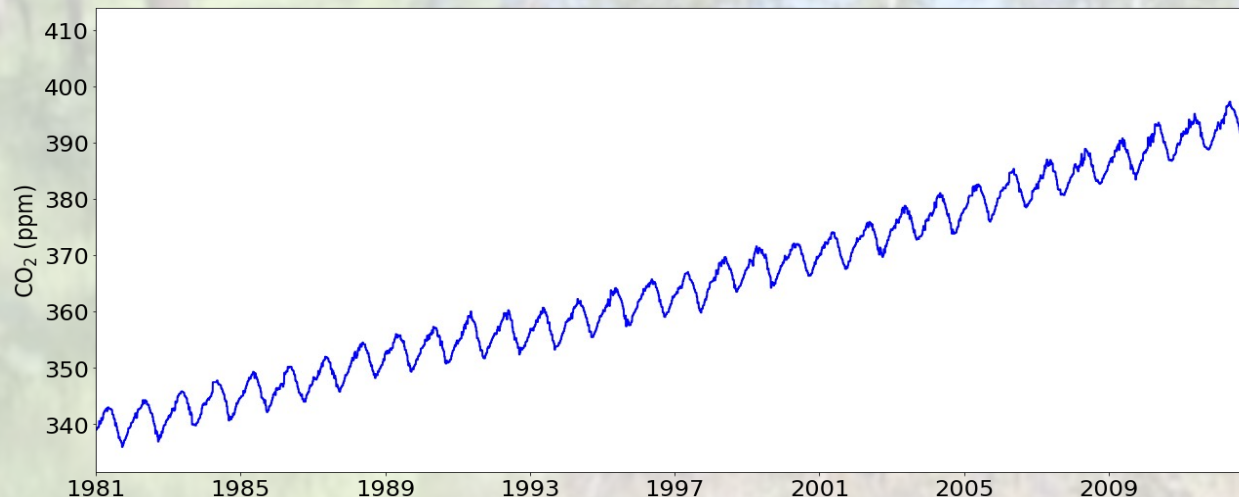
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CO₂ RECORDS

Atmospheric CO₂ levels are needed as input for the VOM model. Therefore, weekly data is taken from the Mauna Loa observatory.

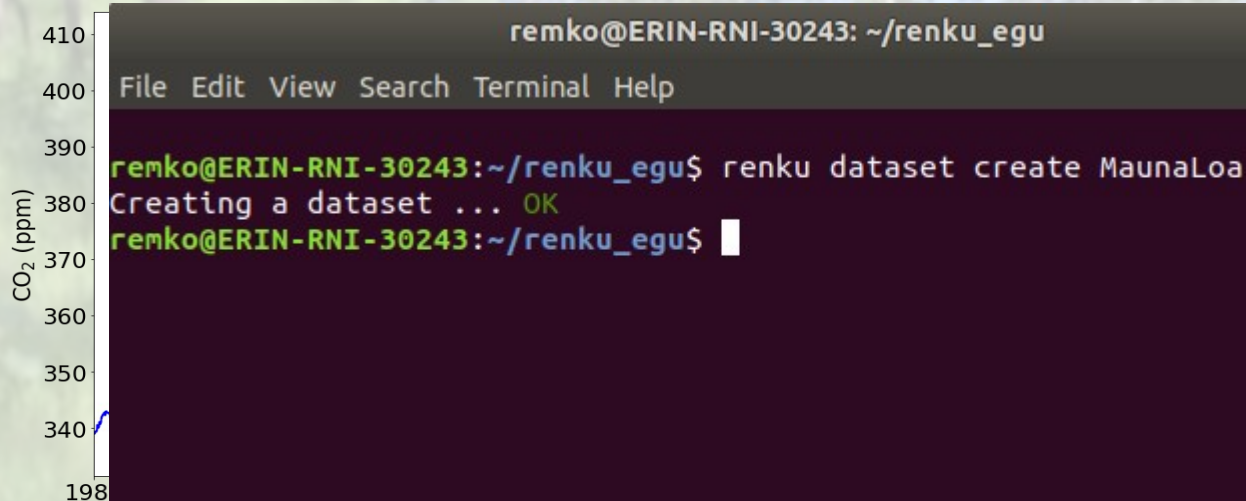
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CO₂ RECORDS

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CO₂ RECORDS

Atmospheric CO₂ levels are needed as input for the VOM model. Therefore, weekly data is taken from the Mauna Loa observatory.

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```
remko@ERIN-RNI-30243: ~/renku_egu
File Edit View Search Terminal Help

remko@ERIN-RNI-30243:~/renku_egu$ renku dataset add MaunaLoa http://scrippsco2.ucsd.edu/assets/data/atmospheric/stations/in_situ_co2/weekly/weekly_in_situ_co2_mlo.csv
Adding data to dataset [REDACTED] 1/1 http://scrippsco2.ucsd.edu/assets/data/atmospheric/stations/in_situ_co2/weekly_in_situ_co2_mlo.csv
Adding data to dataset [REDACTED] 1/1

remko@ERIN-RNI-30243:~/renku_egu$
```

dataset

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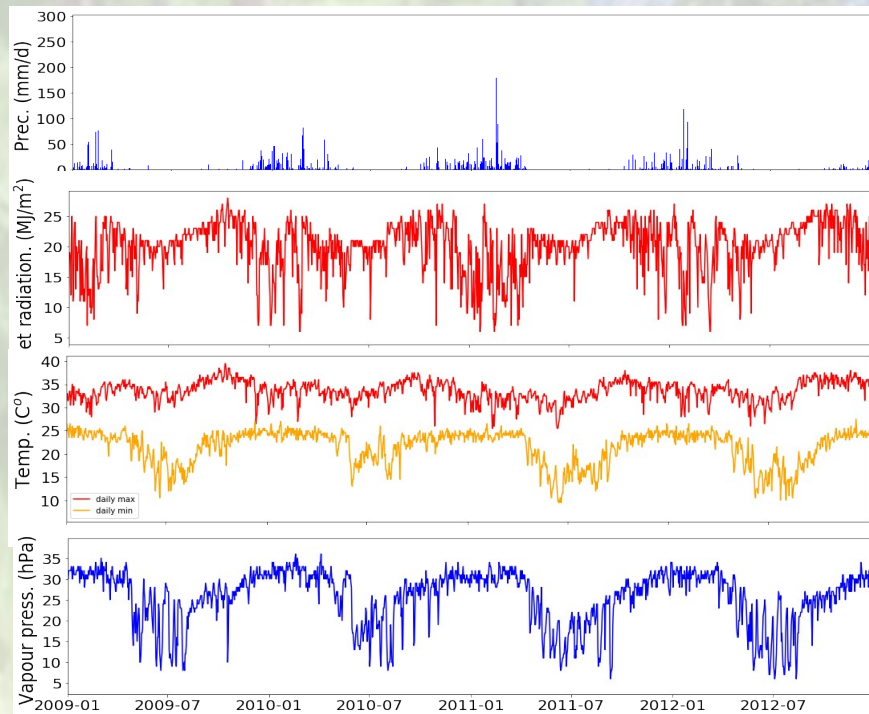
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SILO WEATHERDATA

Meteorological data are needed as input for the VOM model. Data is taken from the Australian Silo weatheroffice.

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SILO WEATHERDATA

Meteorological data are needed as input for the VOM model. Data is taken from the Australian Silo weatheroffice.

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```

remko@ERIN-RNI-30243: ~/renku_egu
File Edit View Search Terminal Help

remko@ERIN-RNI-30243:~/renku_egu$ renku dataset create SILO
Creating a dataset ... OK
remko@ERIN-RNI-30243:~/renku_egu$

```

ku dataset

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SILO WEATHERDATA

Meteorological data are needed as input for the VOM model. Data is taken from the Australian Silo weatheroffice.



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remko@ERIN-RNI-30243: ~/renku_egu

File Edit View Search Terminal Help

```
remko@ERIN-RNI-30243:~/renku_egu$ renku dataset add SILO ../data/Silo/howard.txt
```

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CREATE MODEL INPUT

The meteorological data and the atmospheric CO₂ data need to be processed and formatted in order to serve as input for the model.

dailyweather.prn

~/Documents/renku-projects/VOM_cases_renku/vomcases/data/VOM_input/HowardSprings

Dcum	Day	Month	Year	T.Max	T.Min	Rain	Radn	VP	Pres	Ca
1	1	1	1980	31.50	23.50	10.70	10.00	30.00	1005.00	337.67
2	2	1	1980	28.50	23.50	40.90	6.00	29.00	1004.00	337.67
3	3	1	1980	28.50	23.50	14.10	7.00	30.00	1004.50	337.67
4	4	1	1980	30.00	23.00	14.30	10.00	31.00	1004.50	337.67
5	5	1	1980	31.00	24.00	17.60	12.00	31.00	1005.00	337.67
6	6	1	1980	31.50	24.50	12.90	14.00	33.00	1004.00	337.48
7	7	1	1980	32.00	24.00	85.20	16.00	31.00	1005.50	337.48
8	8	1	1980	33.50	24.00	30.50	24.00	34.00	1006.50	337.48
9	9	1	1980	32.50	22.50	17.30	17.00	31.00	1006.50	337.48
10	10	1	1980	32.50	24.50	8.10	20.00	31.00	1007.00	337.48
11	11	1	1980	34.00	25.00	16.20	22.00	33.00	1008.50	337.48
12	12	1	1980	32.50	26.50	11.20	14.00	34.00	1009.00	337.48
13	13	1	1980	34.00	25.50	17.90	19.00	33.00	1007.50	338.38
14	14	1	1980	34.50	24.00	26.80	15.00	32.00	1008.50	338.38
15	15	1	1980	33.50	24.00	26.10	20.00	34.00	1009.00	338.38
16	16	1	1980	34.00	26.00	2.50	21.00	34.00	1008.50	338.38
17	17	1	1980	32.50	21.50	20.10	14.00	29.00	1009.00	338.38
18	18	1	1980	29.00	23.50	25.70	6.00	30.00	1009.00	338.38
19	19	1	1980	31.50	24.50	8.10	16.00	31.00	1008.00	338.38
20	20	1	1980	33.00	23.50	9.50	20.00	32.00	1009.50	338.49
21	21	1	1980	32.50	24.00	41.60	17.00	30.00	1010.00	338.49
22	22	1	1980	31.50	22.00	10.70	17.00	26.00	1009.00	338.49
23	23	1	1980	32.00	23.50	9.10	18.00	29.00	1009.00	338.49
24	24	1	1980	31.50	24.50	9.00	16.00	32.00	1008.50	338.49
25	25	1	1980	32.00	24.50	1.80	19.00	32.00	1008.50	338.49
26	26	1	1980	31.00	24.50	6.50	16.00	31.00	1007.50	338.49
27	27	1	1980	31.00	23.50	20.00	10.00	31.00	1005.50	338.05
28	28	1	1980	29.50	23.50	23.40	11.00	30.00	1005.00	338.05
29	29	1	1980	31.00	24.50	6.20	14.00	32.00	1005.50	338.05
30	30	1	1980	30.00	25.50	9.70	10.00	30.00	1006.50	338.05
31	31	1	1980	32.50	24.50	3.80	10.00	33.00	1008.50	338.05
32	1	2	1980	31.00	24.50	20.10	12.00	33.00	1010.00	338.05
33	2	2	1980	30.50	22.50	38.40	9.00	30.00	1009.50	338.05
34	3	2	1980	30.50	23.50	14.00	12.00	30.00	1006.50	338.14
35	4	2	1980	27.50	24.00	11.00	7.00	28.00	1004.50	338.14

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CREATE MODEL INPUT

The meteorological data and the atmospheric CO₂

remko@ERIN-RNI-30243: ~/renku_egu

File Edit View Search Terminal Help

```
remko@ERIN-RNI-30243:~/renku_egu$ renku run python3 src_py/write_dailyweather.py  
-im data/Silo/howard.txt -ic data/MaunaLoa/weekly_in_situ_co2_mlo.csv -p linear  
-o data/VOM_input/HowardSprings/dailyweather.prn
```

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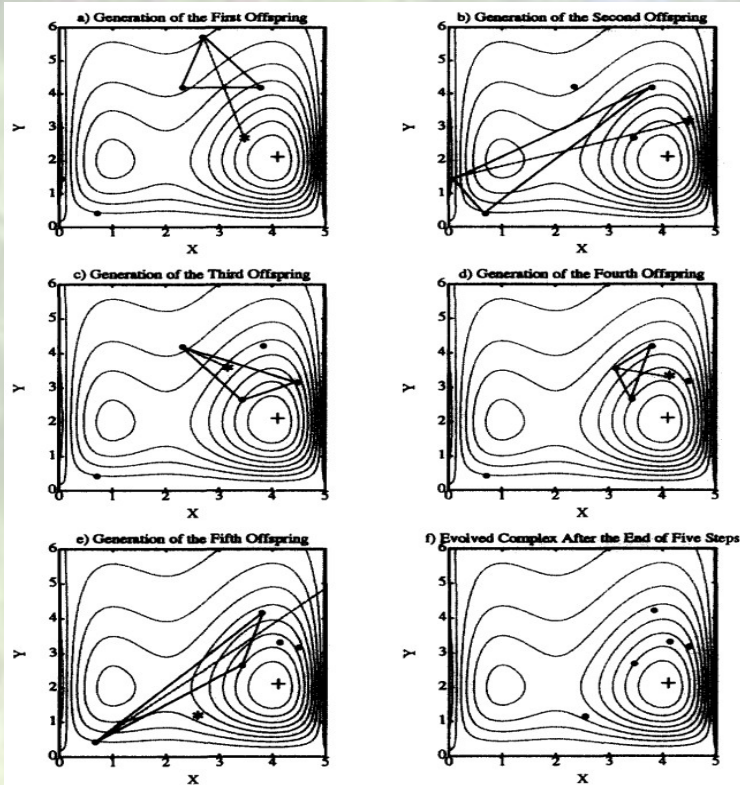
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RUN VOM OPTIMIZATION

The Shuffled Complex Evolution algorithm is used in order to derive the vegetation properties that maximize NCP.

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Renku workflow



- Sample s points
- Rank points
- Partition into complexes
- Evolve complex
- Shuffle complexes
- Check convergence

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RUN VOM OPTIMIZATION

The Shuffled Complex Evolution algorithm is used in order to derive the vegetation properties that maximize NCP.



- Sample s points

```
remko@ERIN-RNI-30243: ~/renku_egu
File Edit View Search Terminal Help
remko@ERIN-RNI-30243:~/renku_egu$ renku run bash run_vom.sh ../../data/VOM_input/HowardSprin
gs/dailyweather.prn vom_namelist ../../src/VOM/VOM_Fortran/VOM-code/*
```

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UNCERTAINTY ESTIMATES & STATISTICS

The model runs with the 5% highest NCP are selected in order to construct uncertainty bounds.

To assess the model performance, several independent datasets are used:

- DINGO fluxdata
- Fraction vegetation cover from fPar

The performances are assessed by:

- Timeseries with uncertainties
- Relative errors annuan and seasonal means
- Kling-Gupta efficiencies
- Residuals

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UNCERTAINTY ESTIMATES & STATISTICS

The model runs with the 5% highest NCP are selected in order to construct uncertainty bounds.

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```
remko@ERIN-RNI-30243: ~/renku_egu
File Edit View Search Terminal Help

remko@ERIN-RNI-30243:~/renku_egu$ renku run python3 src_py/sce_uncertainty.py -i
data/VOM_output/HowardSprings/sce_out.txt -o data/VOM_output/HowardSprings/free
drainage_cpcff1.0/bestruns/ -p -w work/HowardSprings/freedrainage_cpcff1.0/best/
5 -op 1 1 1 1 1 1 0 1 -d data/VOM_input/HowardSprings/dailyweather.prn -eo data
/DINGO/Ea_howard.txt -ea data/DINGO/GPPdaily_howard.txt
```

T

- T
- R
- means
- Kling-Gupta efficiencies
- Residuals

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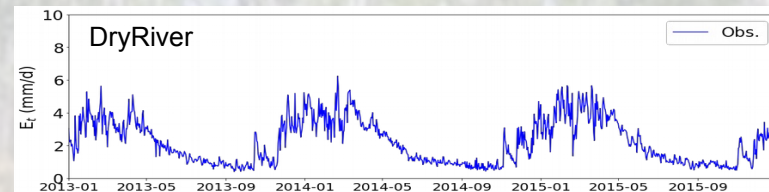
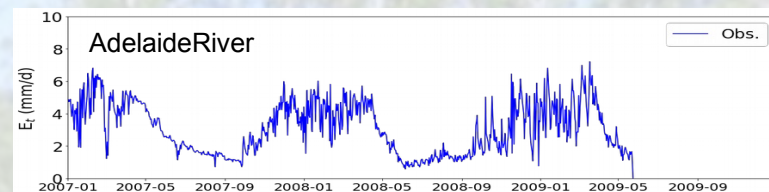
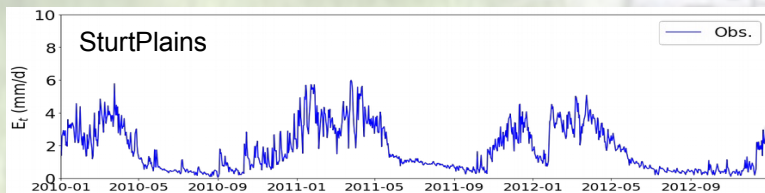
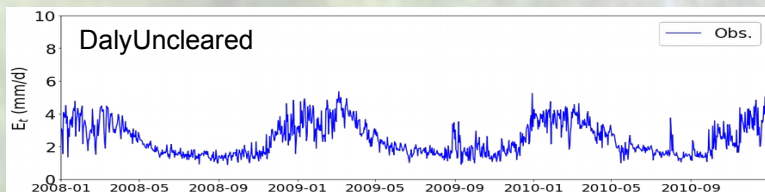
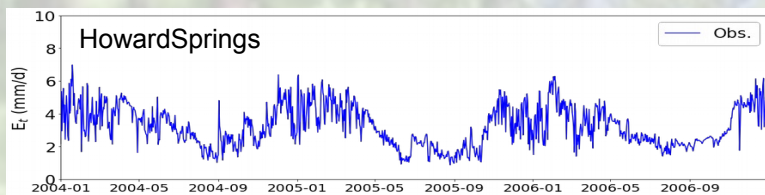
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DINGO

Fluxes are derived with the DINGO algorithm from the flux towers at the study sites.



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DINGO

Fluxes are derived with the DINGO algorithm from the
flux towers at the study sites

```
remko@ERIN-RNI-30243: ~/renku_egu
File Edit View Search Terminal Help

remko@ERIN-RNI-30243:~/renku_egu$ renku dataset create DINGO
Creating a dataset ... OK
remko@ERIN-RNI-30243:~/renku_egu$
```

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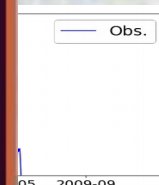
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DINGO

Fluxes are derived with the DINGO algorithm from the flux towers at the study sites.

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8 HowardSprings Obs.

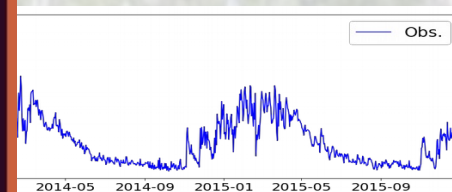
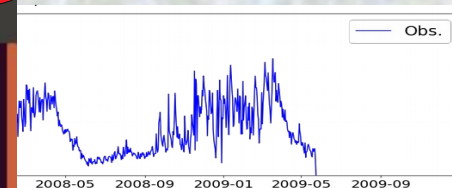
remko@ERIN-RNI-30243: ~/renku_egu

File Edit View Search Terminal Help

```
remko@ERIN-RNI-30243:~/renku_egu$ renku dataset add DINGO ../data/DINGO/Ea_howar
d.txt
```

```
remko@ERIN-RNI-30243:~/renku_egu$ renku dataset add DINGO ../data/DINGO/GPPdaily
_howard.txt
```

```
remko@ERIN-RNI-30243:~/renku_egu$
```



create renku dataset

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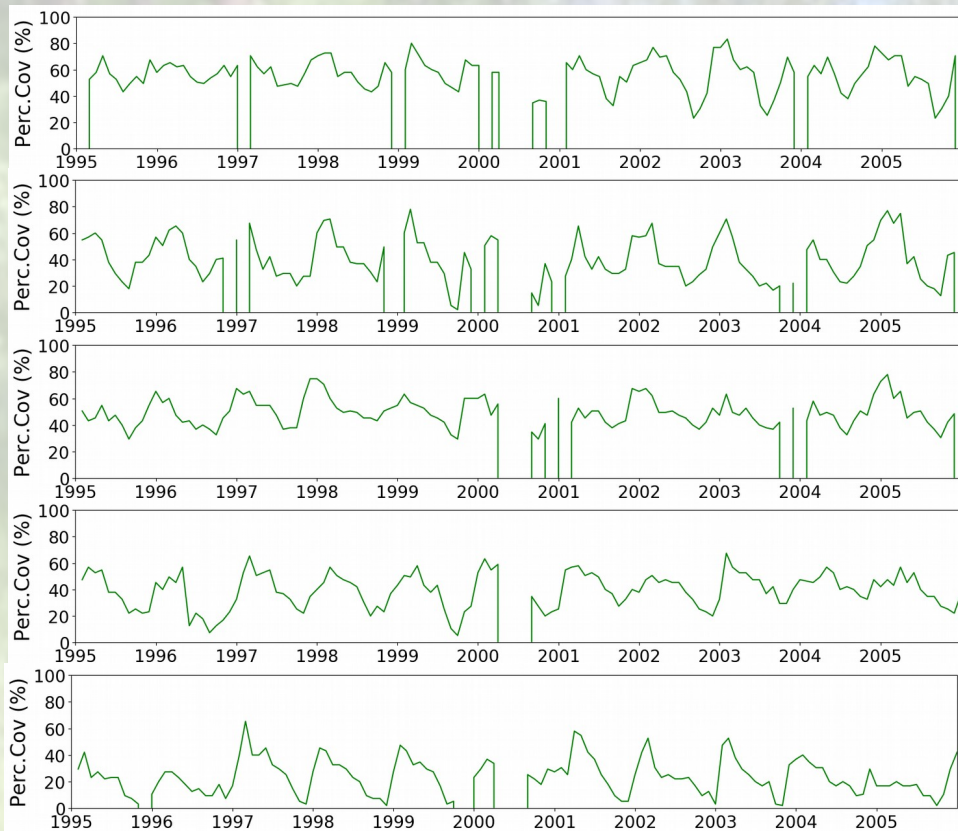
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FRACTIONAL COVER

The Enhanced Vegetation Index from MODIS is used to compare the modelled and observed vegetation dynamics.



Fractional cover derived from satellite observed fPAR are used to compare with modelled vegetation cover

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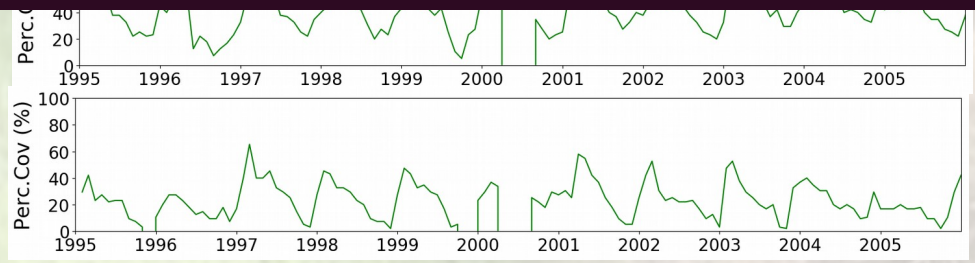
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```
remko@ERIN-RNI-30243: ~/renku_egu
File Edit View Search Terminal Help

remko@ERIN-RNI-30243:~/renku_egu$ renku dataset create fPAR
Creating a dataset ... OK
remko@ERIN-RNI-30243:~/renku_egu$
```

derived
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Create renku dataset

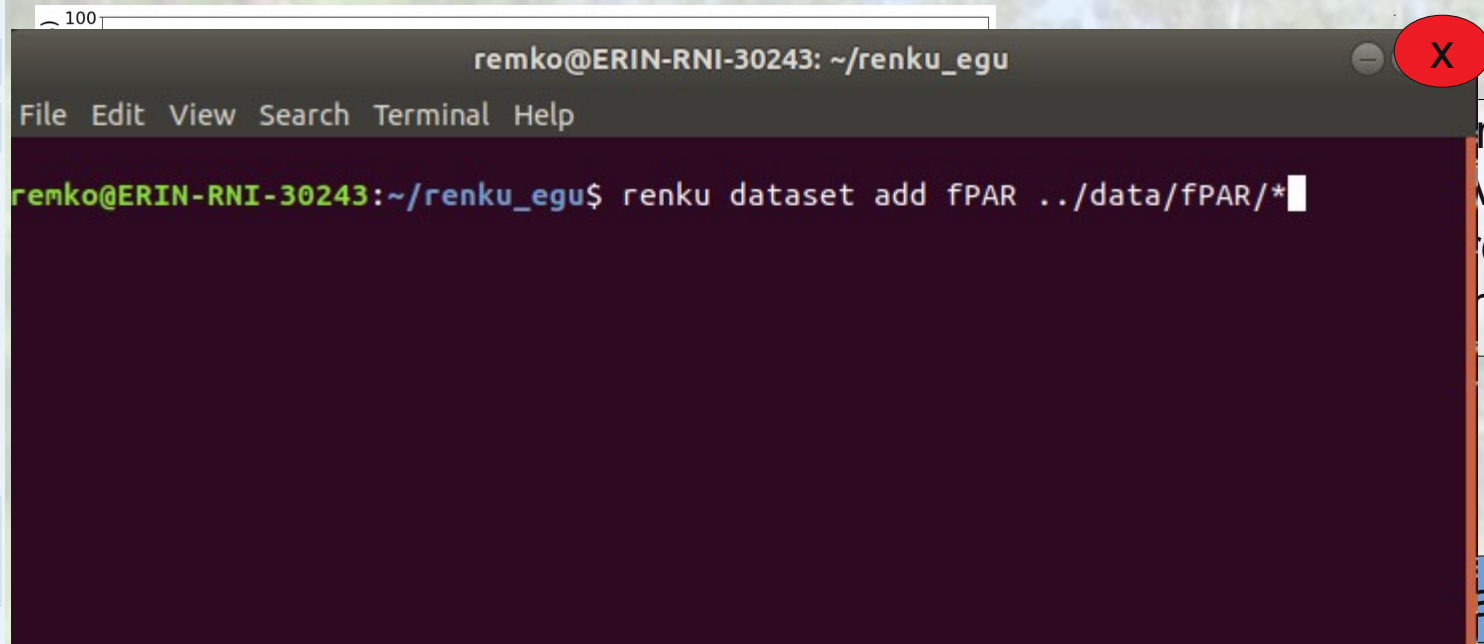
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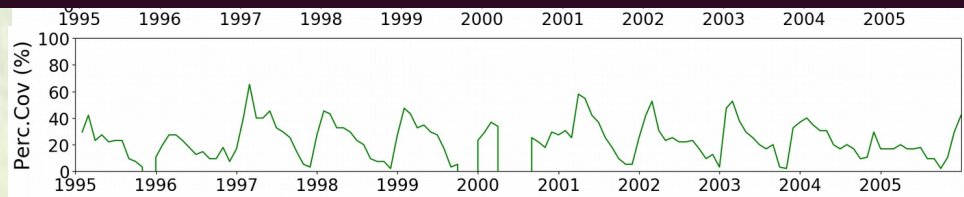
The Enhanced Vegetation Index from MODIS is used to compare the modelled and observed vegetation dynamics.

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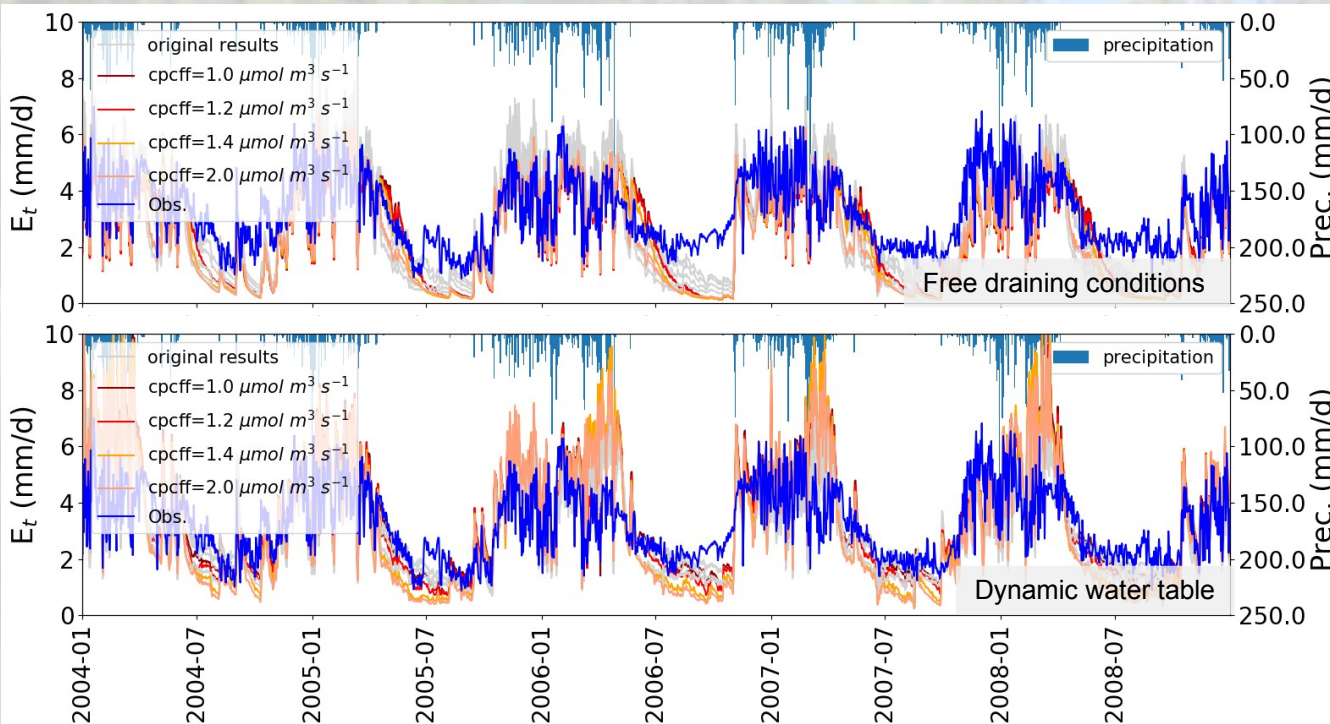
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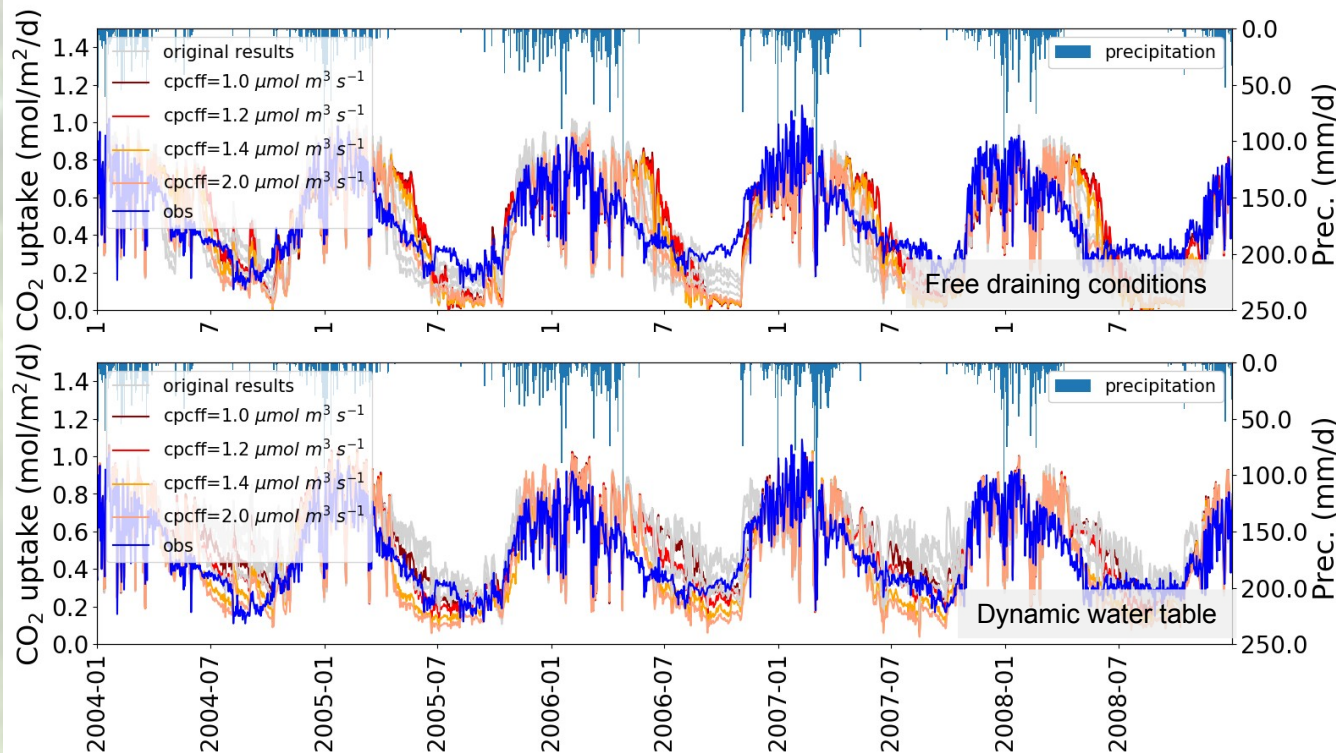
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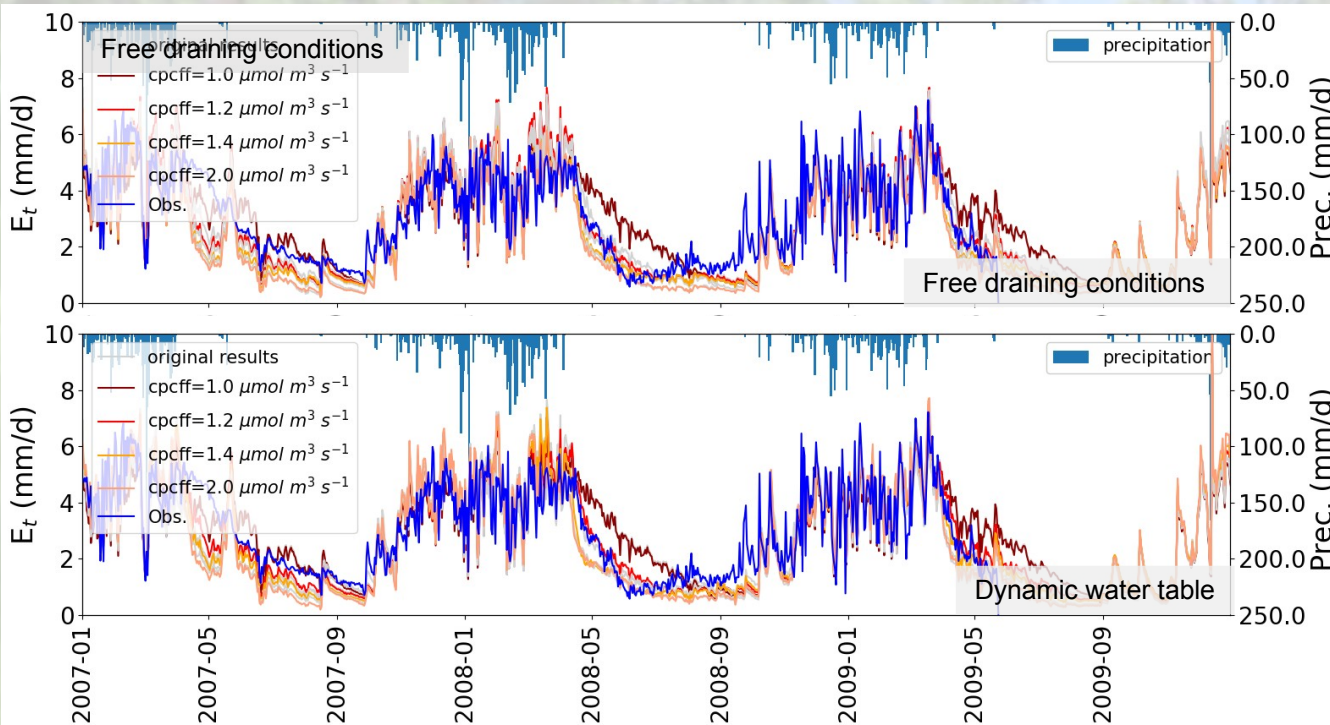
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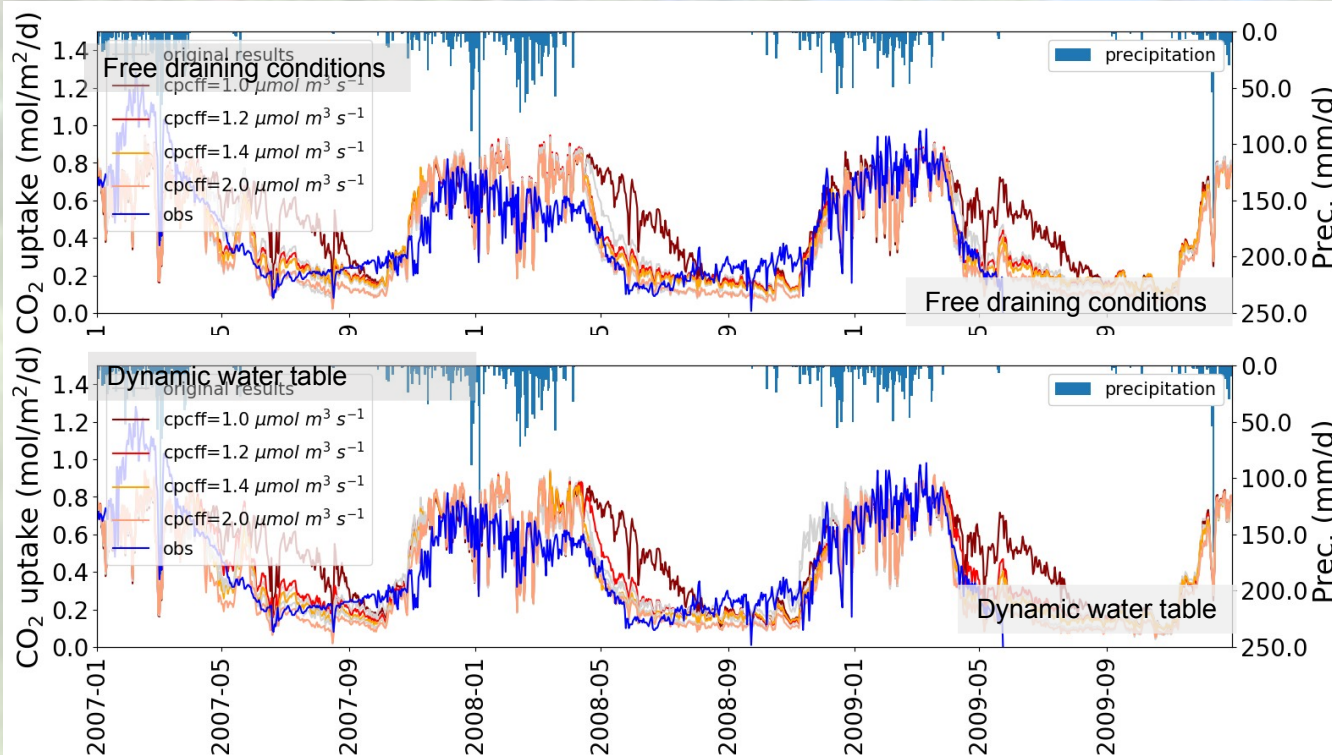
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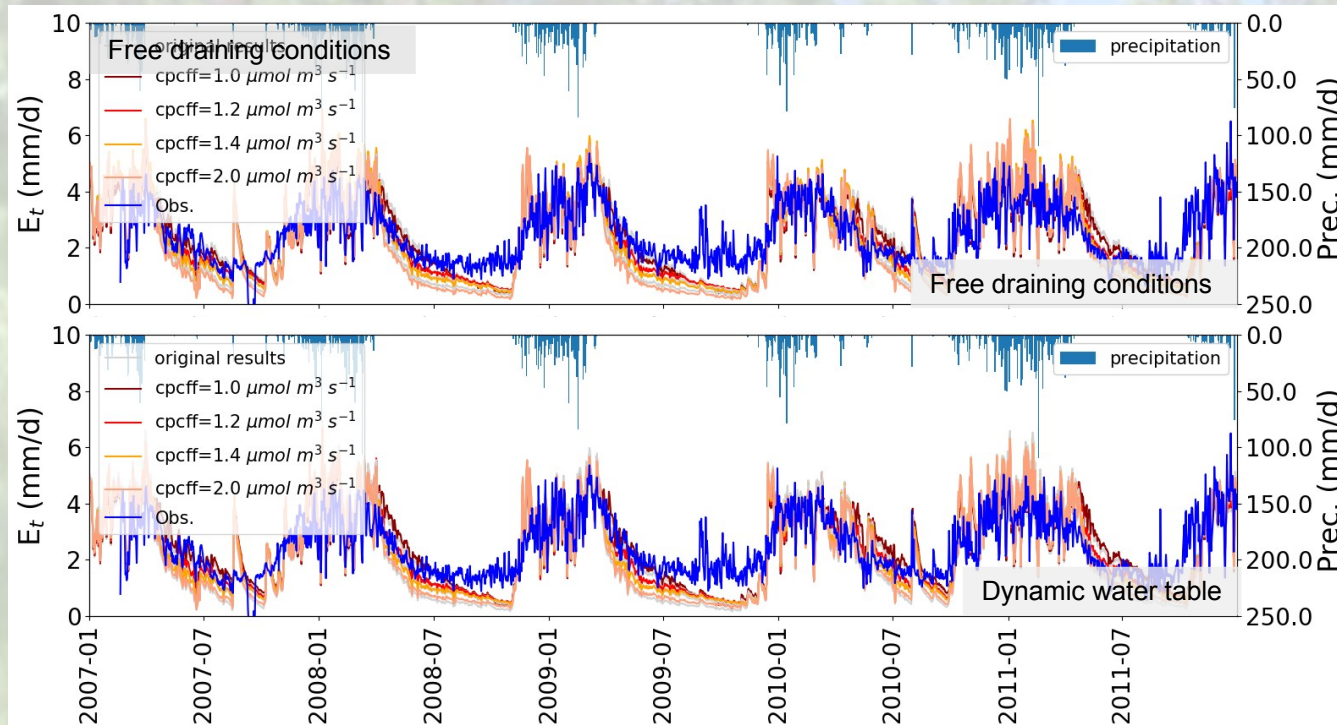
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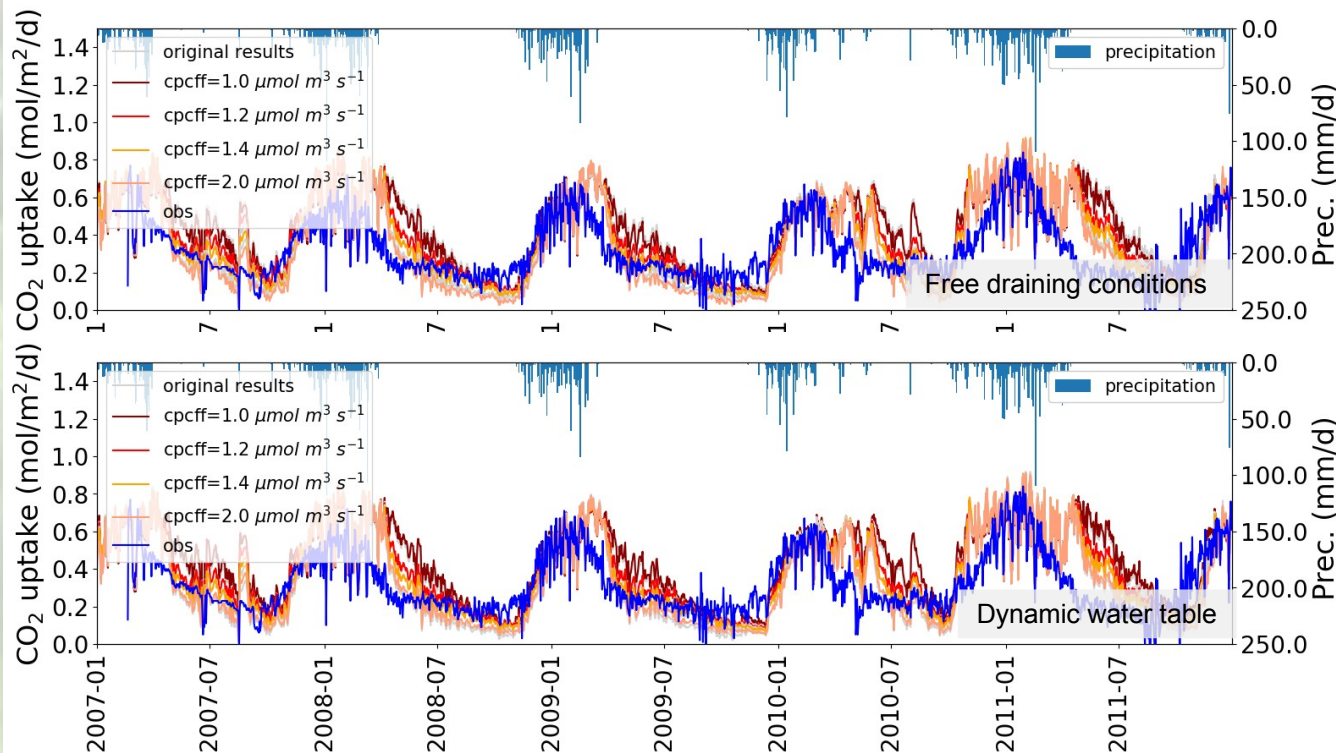
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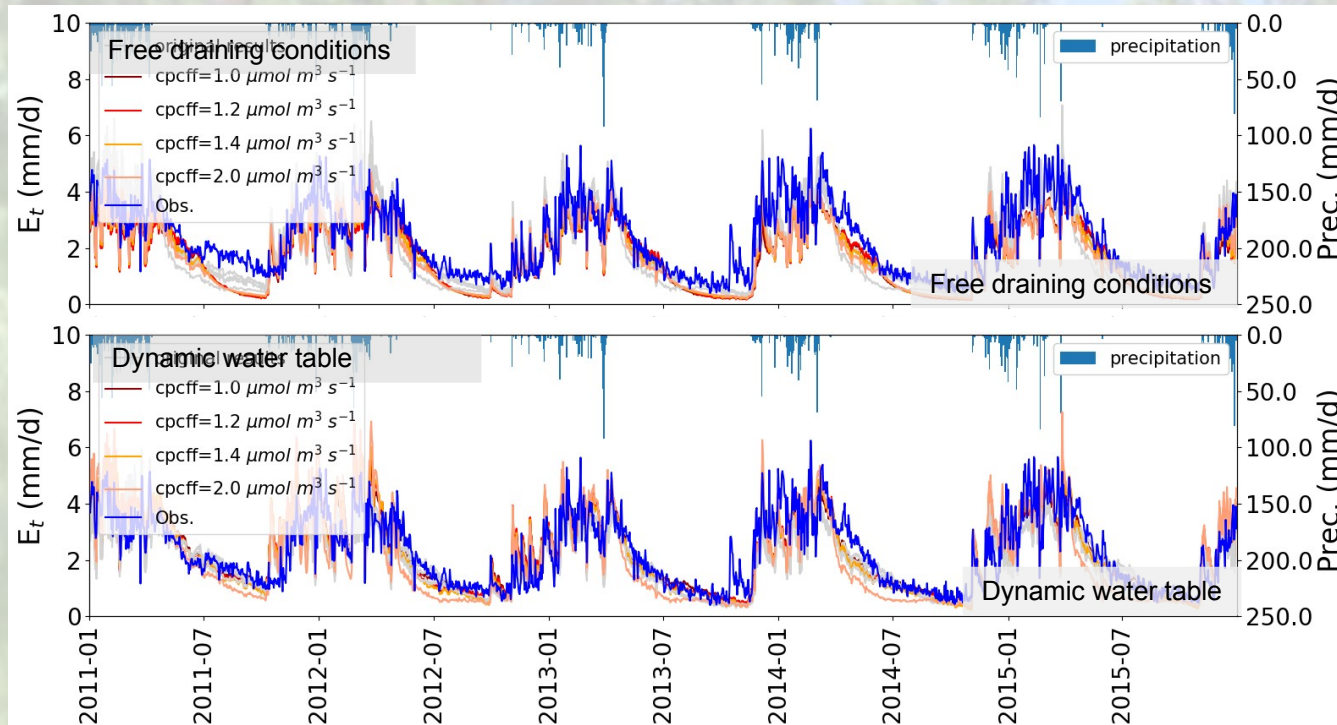
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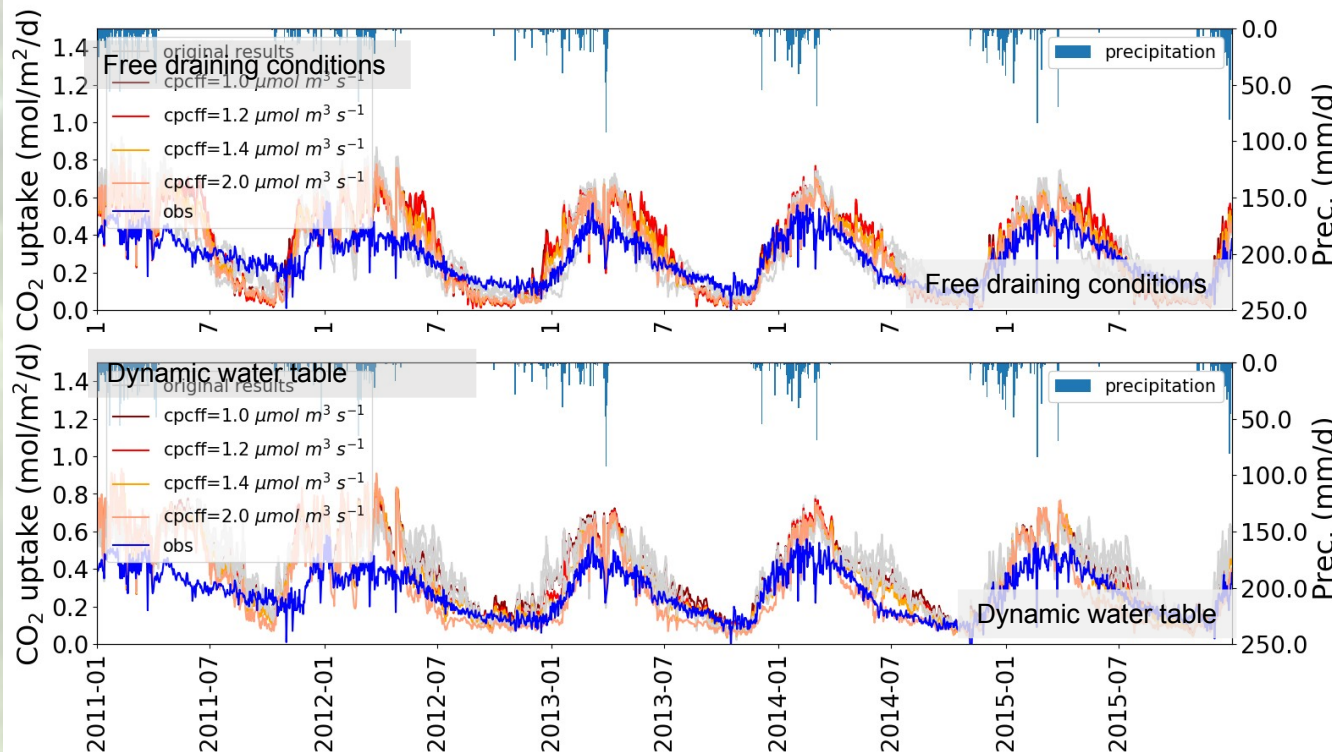
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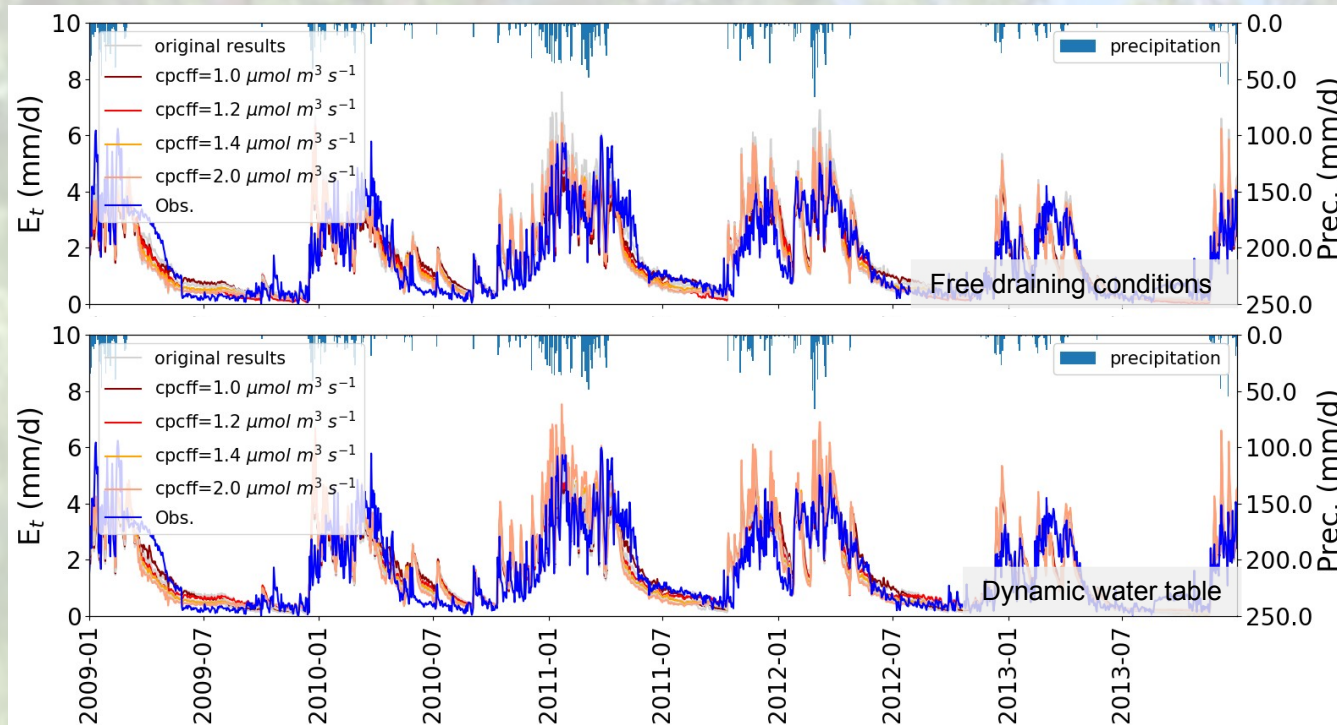
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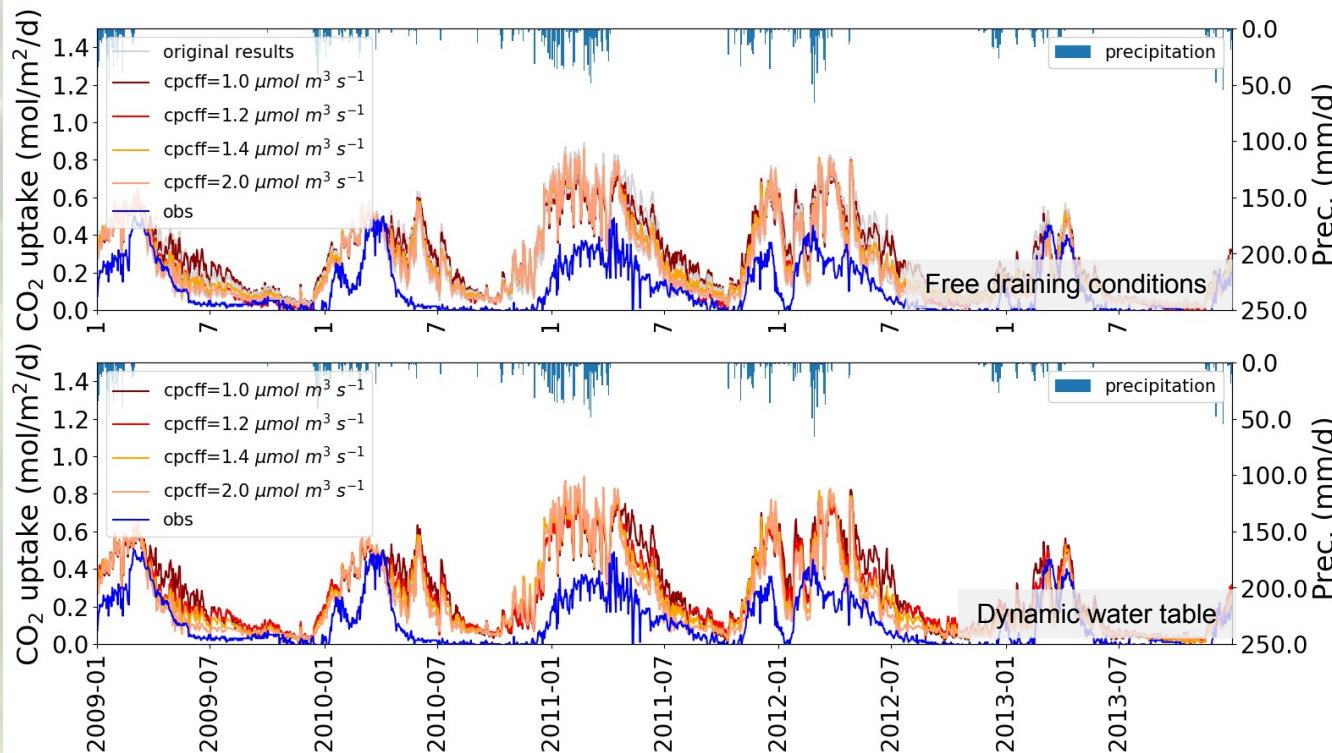
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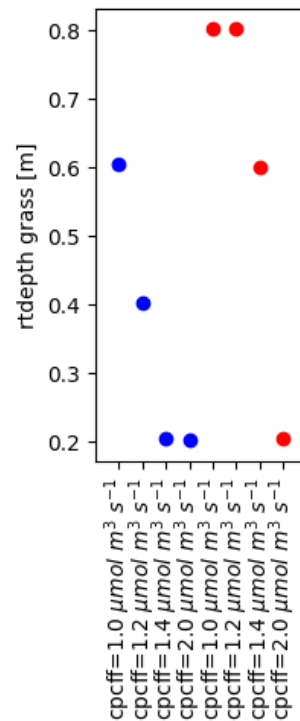
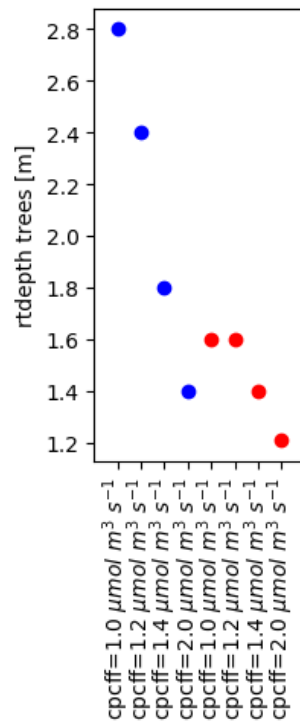
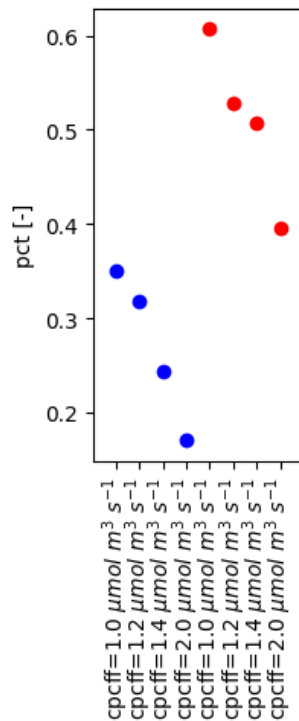
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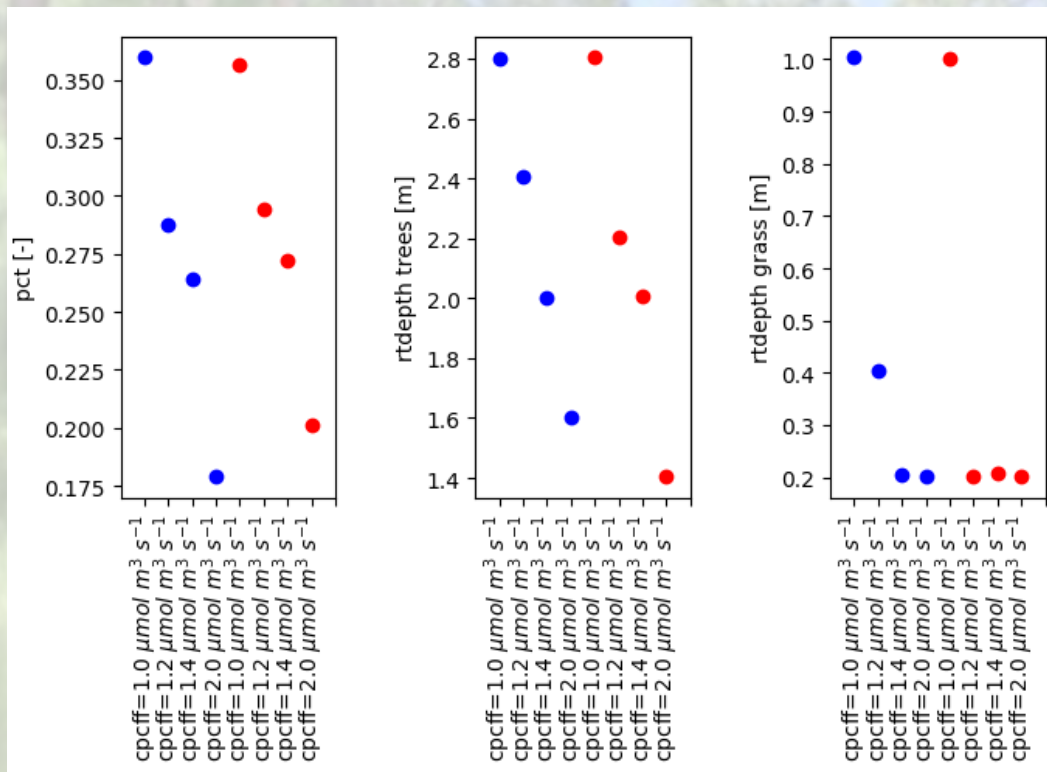
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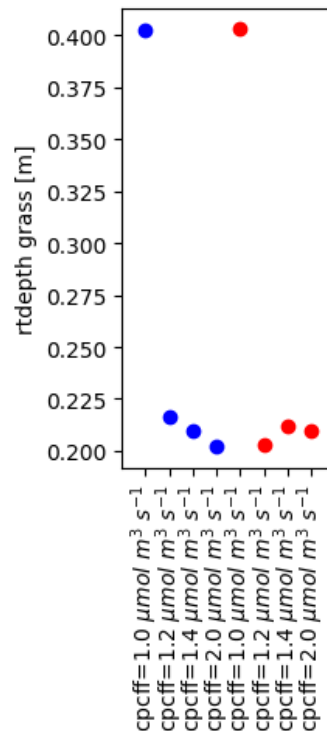
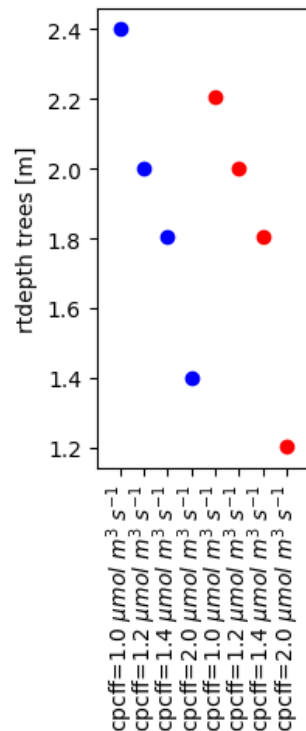
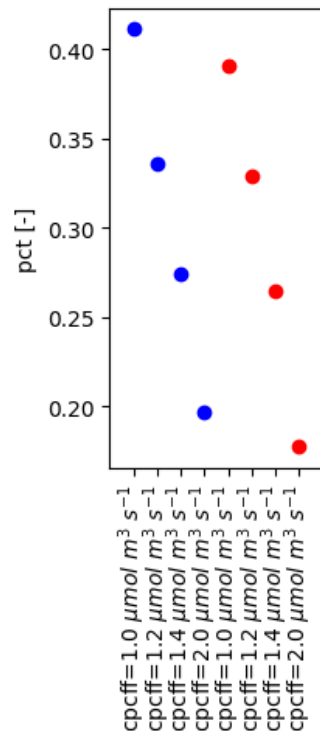
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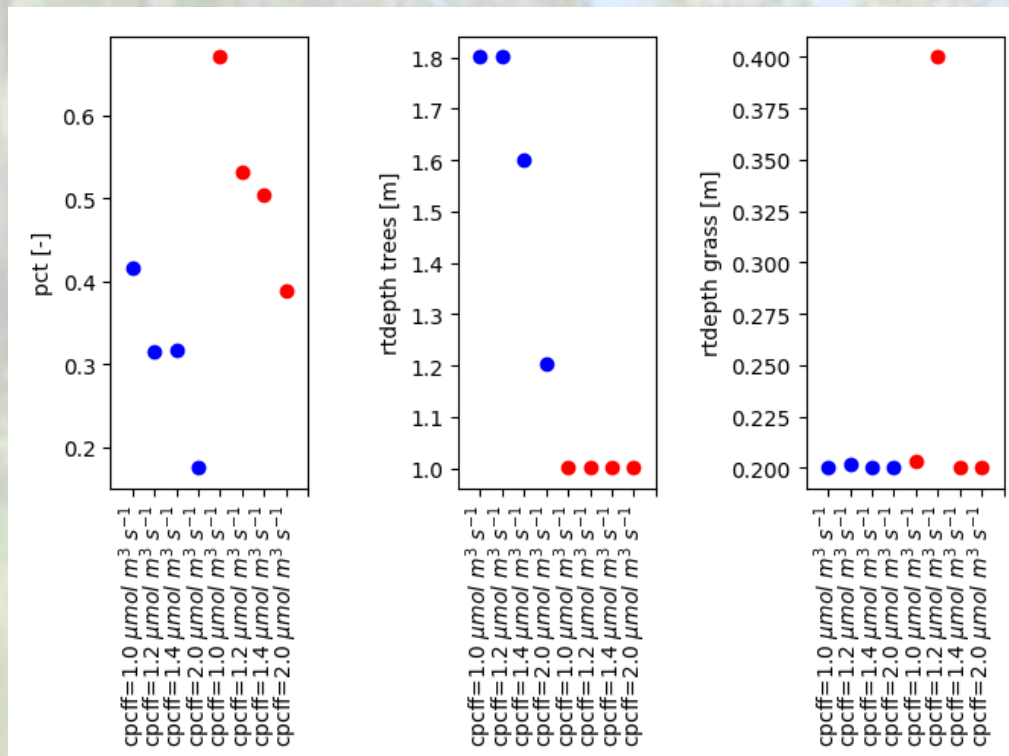
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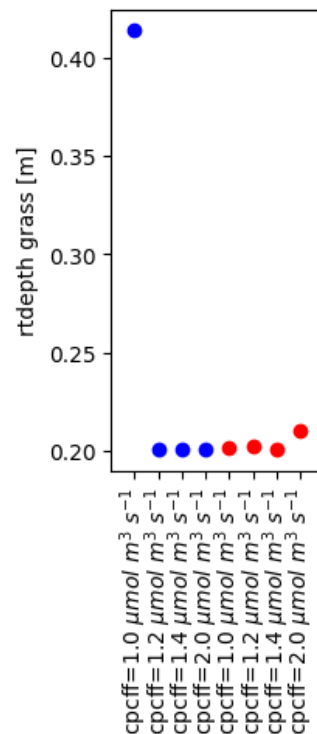
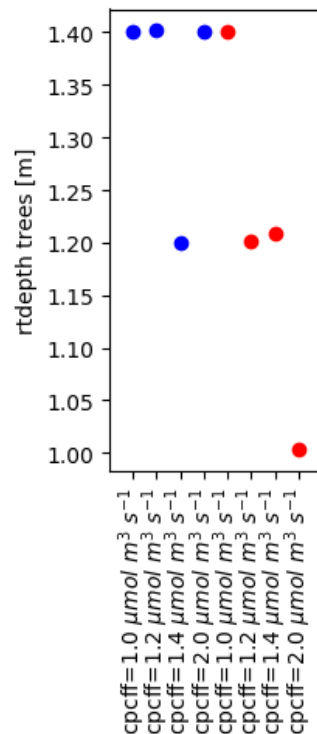
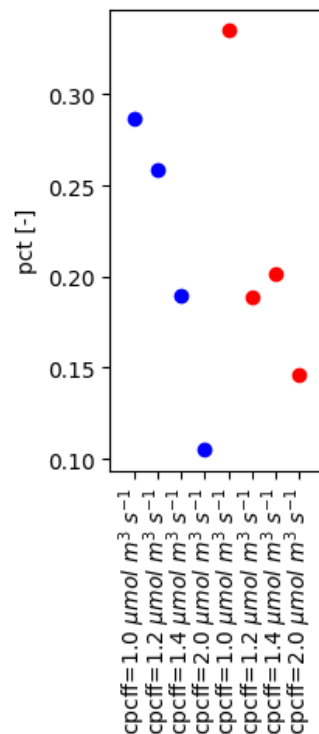
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