



# Dynamic versus static representations of land use change in SWAT

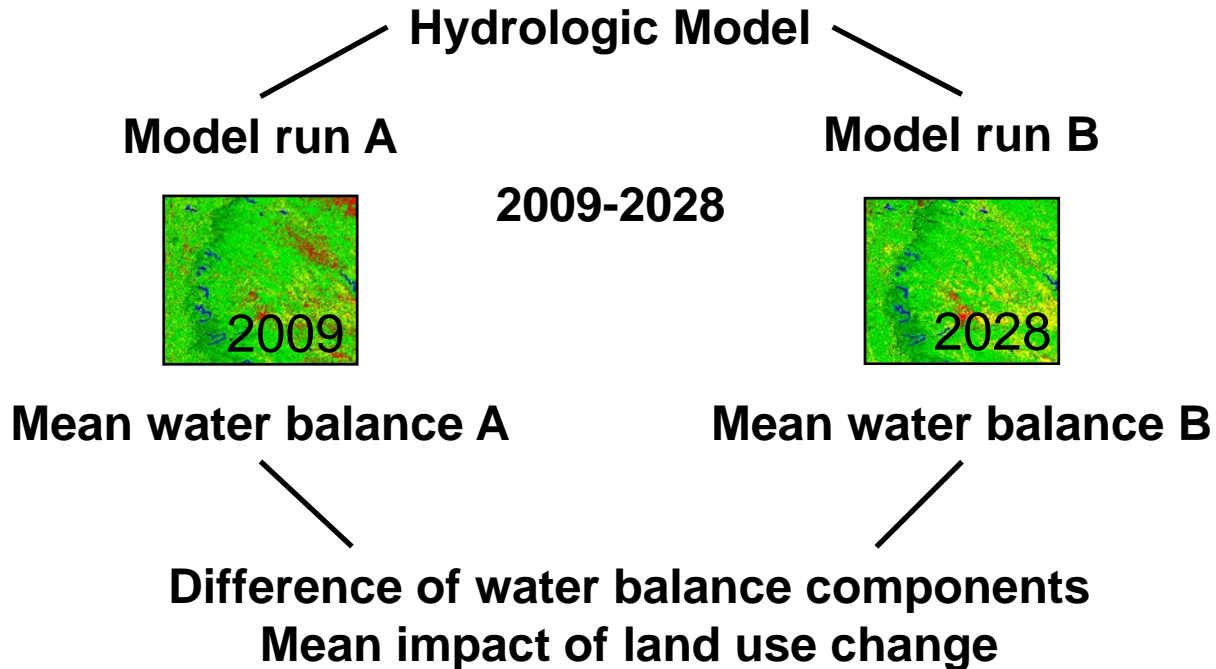
*P.D. Wagner, S. Murty B., B. Narasimhan,  
S. Kumar, N. Fohrer, P. Fiener*



# 1. Motivation

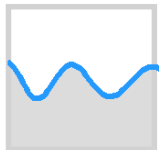
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## Static Delta-Approach to derive impacts of land use change on water resources



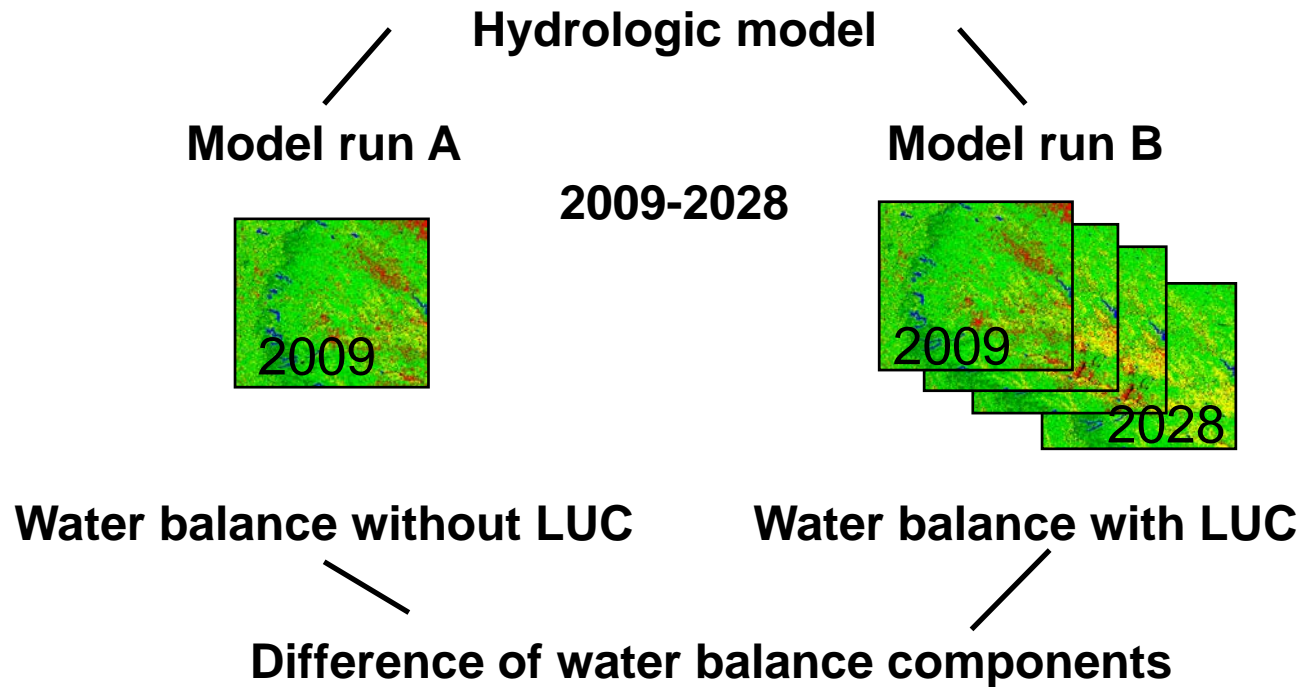
**Result: long-term average, dynamics are not represented**

**=> Integration of dynamic land use change  
in a hydrologic model (possible in SWAT since 2010)**



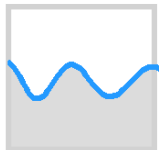
# 1. Motivation

## Integration of dynamic land use change\*



## Temporally differentiated impacts of land use change

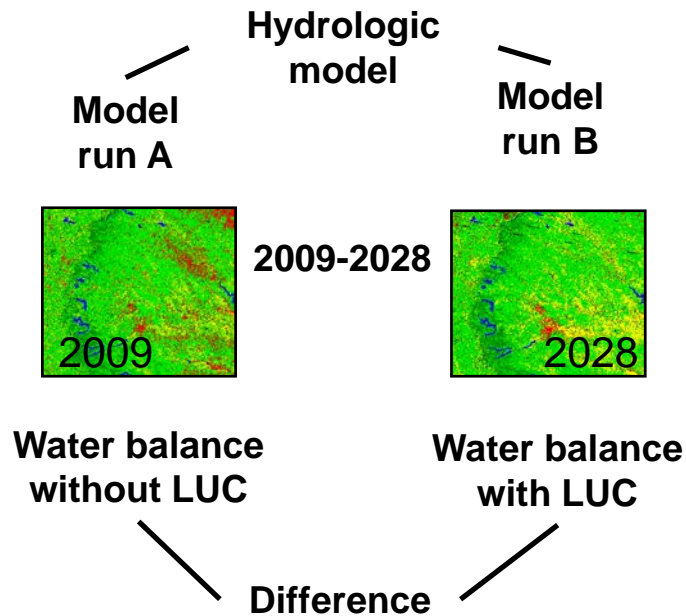
\*Wagner, P.D., S. Murty Bhallamudi, B. Narasimhan, L.N. Kantakumar, K.P. Sudheer, S. Kumar, K. Schneider, P. Fiener, 2016. Dynamic integration of land use changes in a hydrologic assessment of a rapidly developing Indian catchment. *Science of the Total Environment*, 539: 153-164.



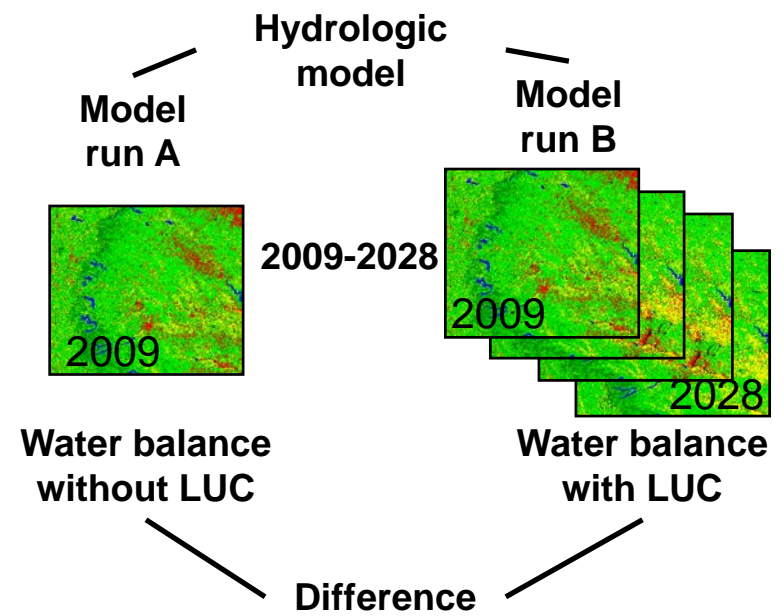
# 1. Objective

What is the impact of using dynamic land use information as compared to using static land use information?

## Static approach

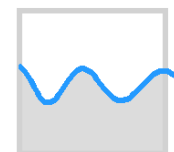
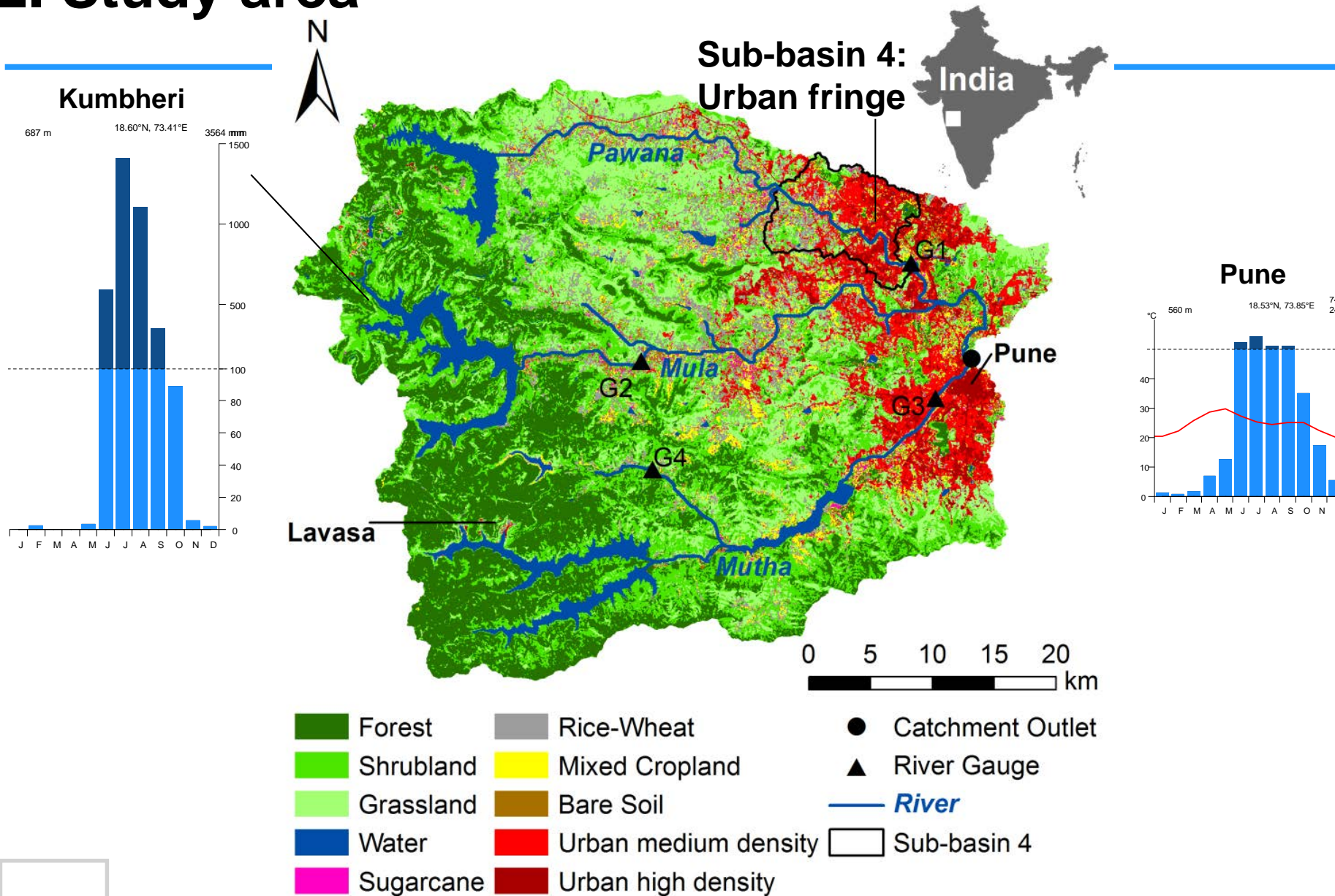


## Dynamic approach



**Difference of predicted impacts**

# 2. Study area



# 3. Materials & Methods

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## Land use scenario 2009 to 2028

- Land use model SLEUTH extrapolates trends from the past
- Development plan of new „hill station“ city Lavasa in the Western Ghats

## Hydrologic model SWAT

- SWAT-Model-Runs from 2009 to 2028
  - with annual land use updates
  - compared to model runs with static land use information

## Model Validation\*

- Land use model: ROC urban 80%; deviations < 3% per land use class
- Hydrologic model: Nash-Sutcliffe efficiencies of 0.67 and 0.68

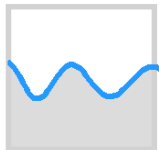
**=> Both models show reasonable performance**

\*Wagner, P.D., S. Murty Bhallamudi, B. Narasimhan, L.N. Kantakumar, K.P. Sudheer, S. Kumar, K. Schneider, P. Fiener, 2016. Dynamic integration of land use changes in a hydrologic assessment of a rapidly developing Indian catchment. *Science of the Total Environment*, 539: 153-164.

# 3. Land Use Scenario

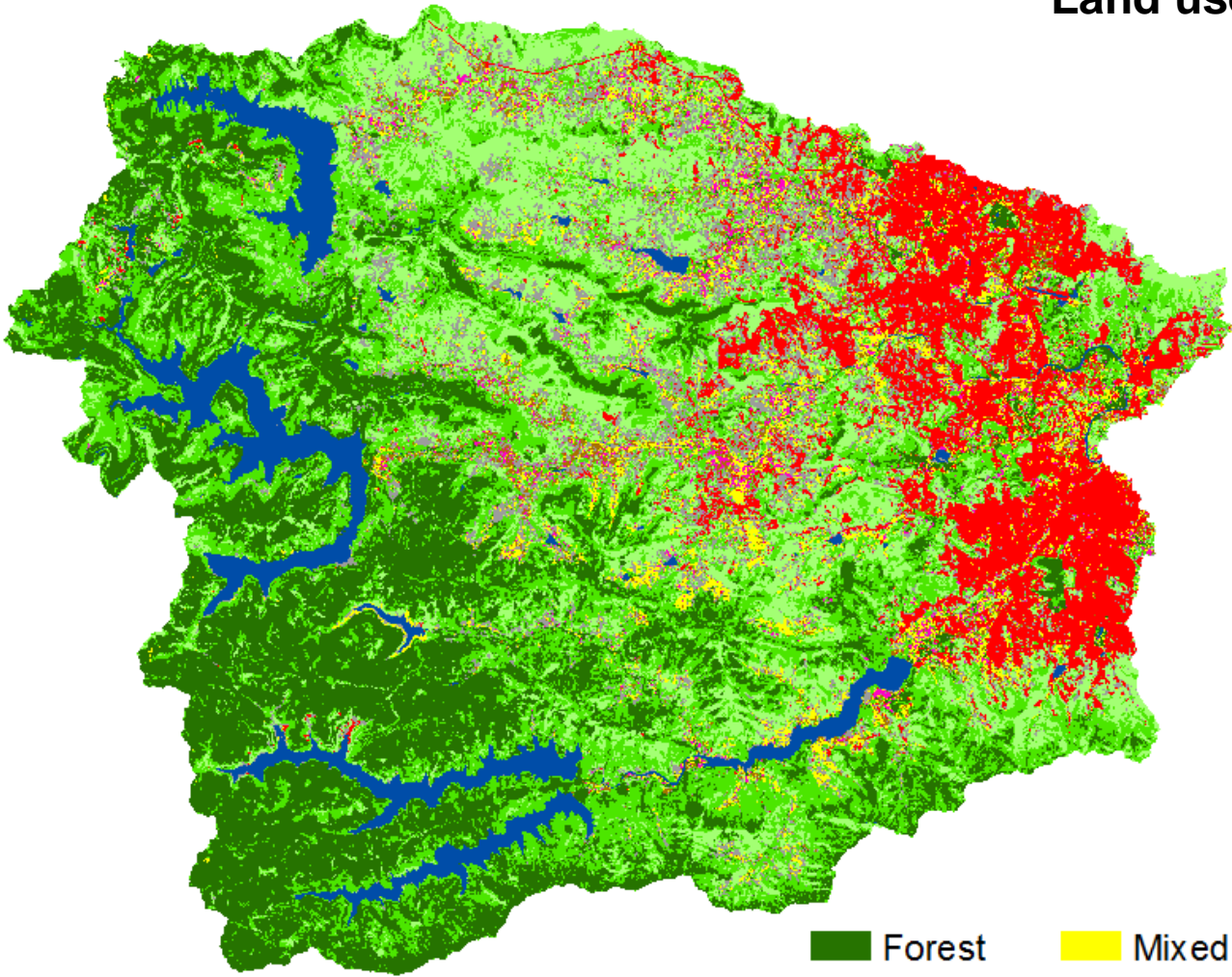
## Projected Land use change between 2009 and 2028

Land use	Catchment	Sub-basin 4 (urban fringe)	Sub-basin 24 (Lavasa)
Forest	-0.3%	-0.8%	<u>-8.3%</u>
Shrubland	-2.6%	-2.9%	-3.4%
Grassland	-1.4%	-5.4%	-0.3%
Cropland	-3.6%	<u>-14.0%</u>	-0.3%
Water	0.0%	0.0%	0.0%
Urban medium density	+6.0%	<u>+15.6%</u>	<u>+9.7%</u>
Urban high density	+1.9%	<u>+7.5%</u>	+2.5%

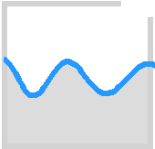


# 3. Land Use Scenario

Land use classification  
**2009/10**



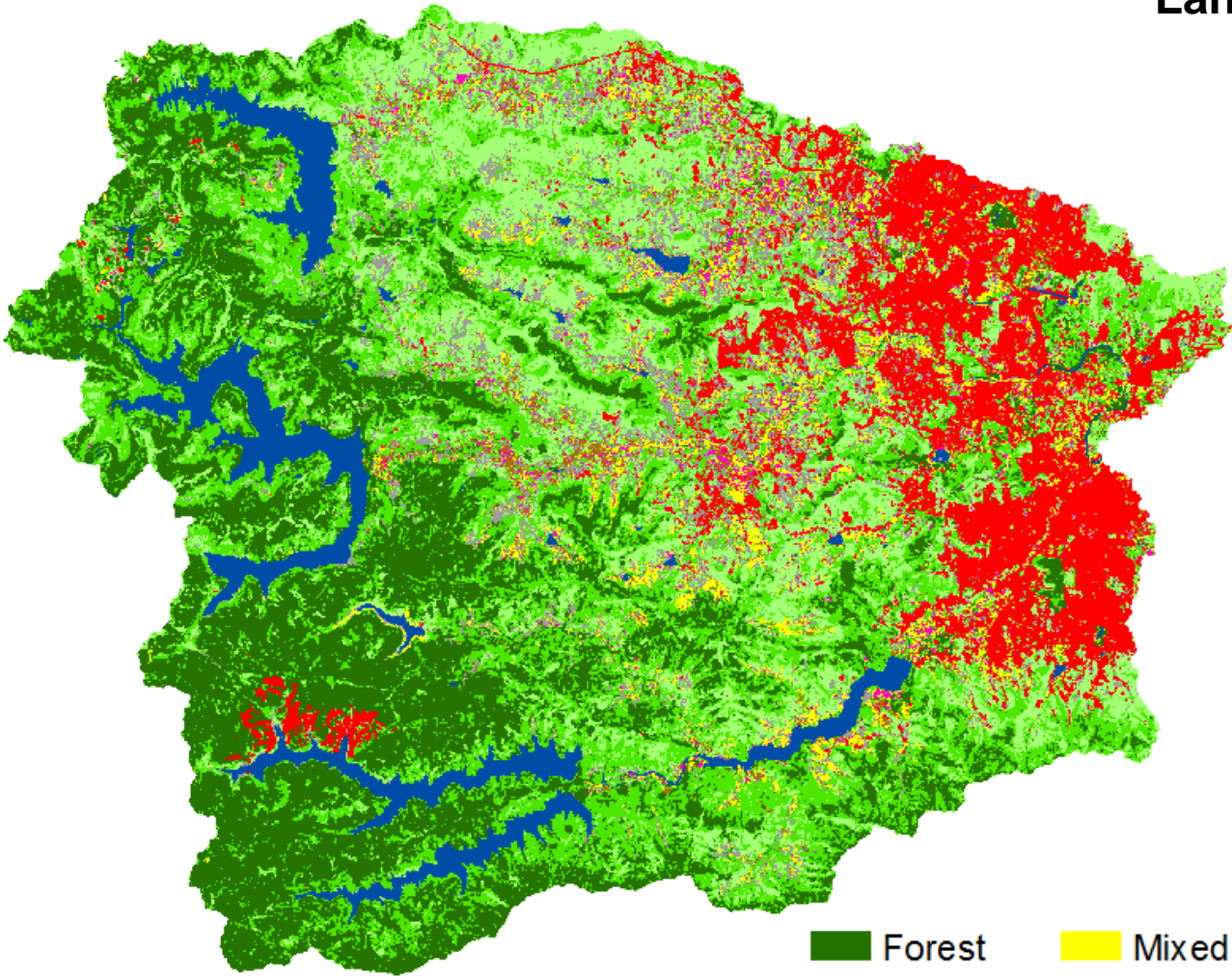
- |           |                |           |
|-----------|----------------|-----------|
| Forest    | Mixed Cropland | Bare Soil |
| Shrubland | Rice-Wheat     | Water     |
| Grassland | Sugarcane      | Urban     |



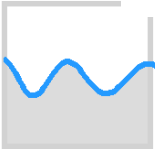


# 3. Land Use Scenario

Land use scenario  
**2014/15**

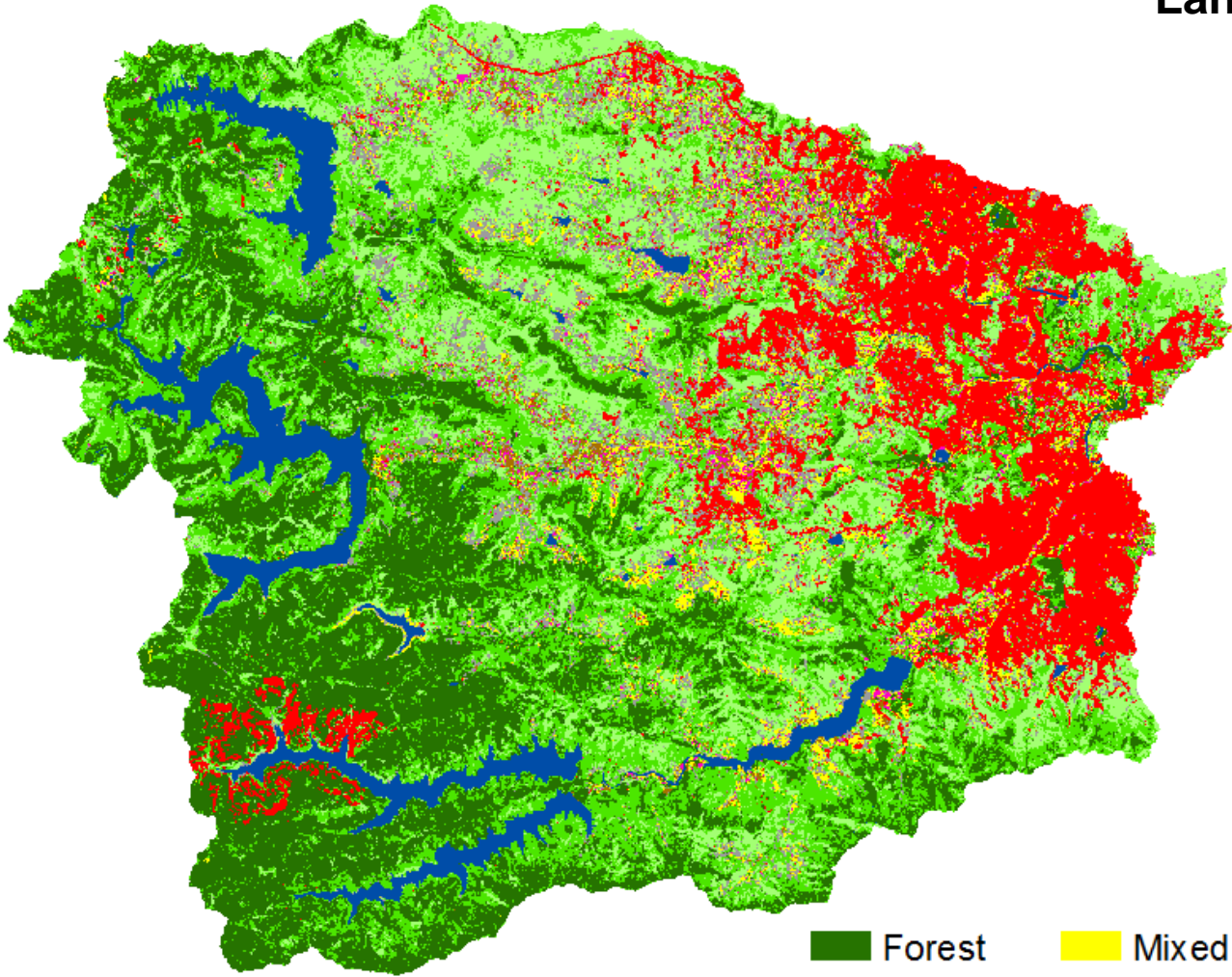


- |           |                |           |
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| Forest    | Mixed Cropland | Bare Soil |
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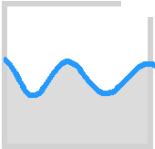


# 3. Land Use Scenario

Land use scenario  
**2018/19**

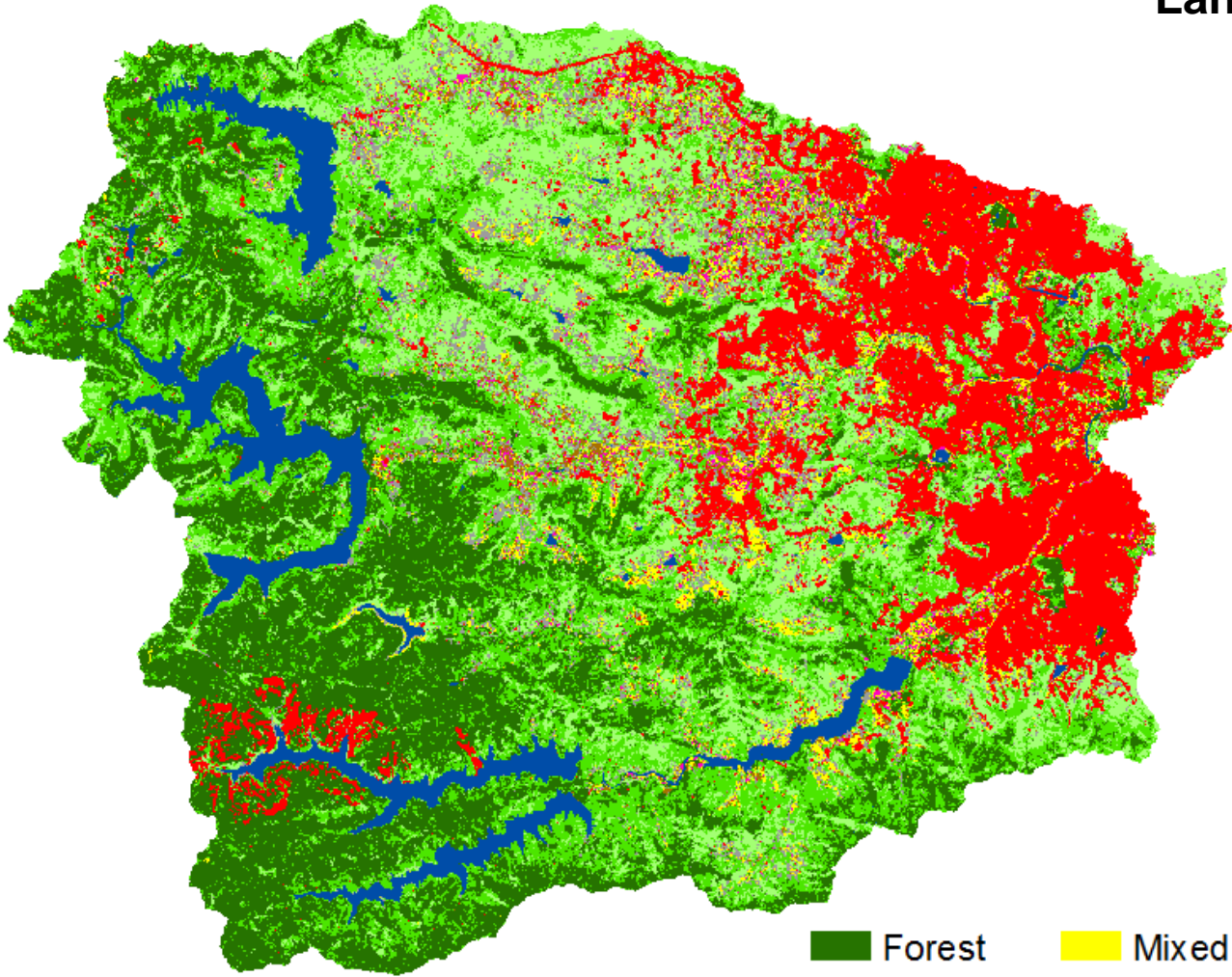


- |           |                |           |
|-----------|----------------|-----------|
| Forest    | Mixed Cropland | Bare Soil |
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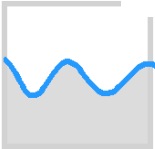


# 3. Land Use Scenario

Land use scenario  
**2024/25**

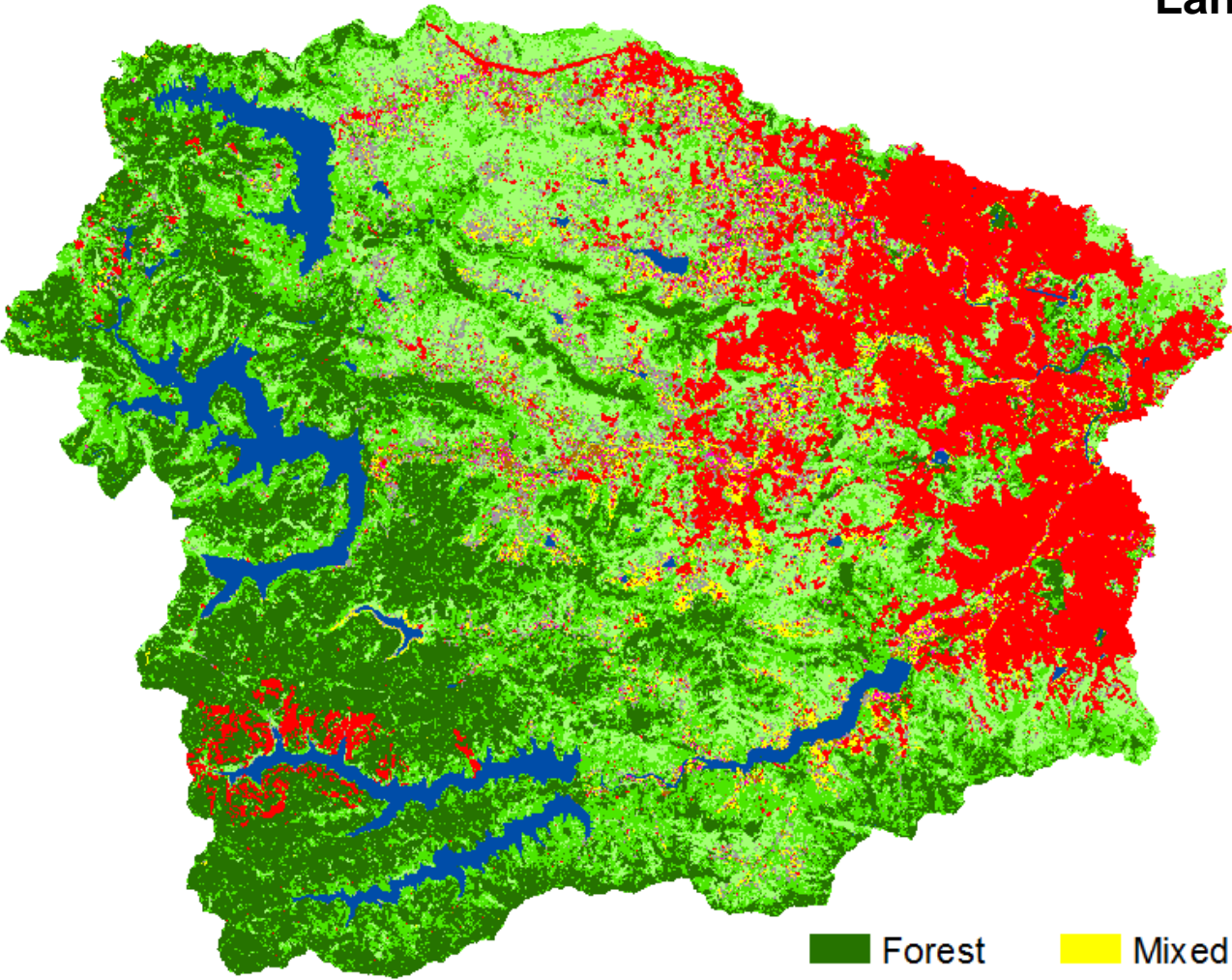


- Forest
- Shrubland
- Grassland
- Mixed Cropland
- Rice-Wheat
- Sugarcane
- Bare Soil
- Water
- Urban

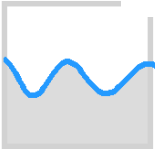


# 3. Land Use Scenario

Land use scenario  
**2028/29**

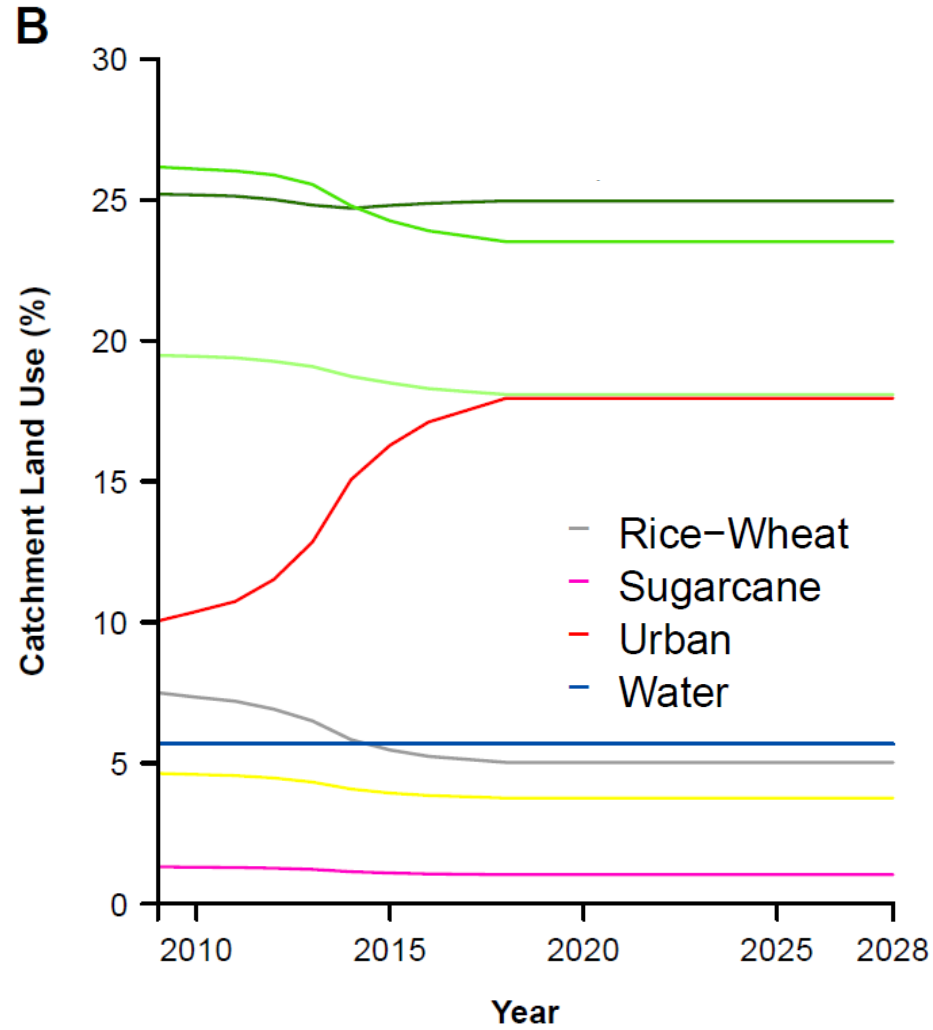
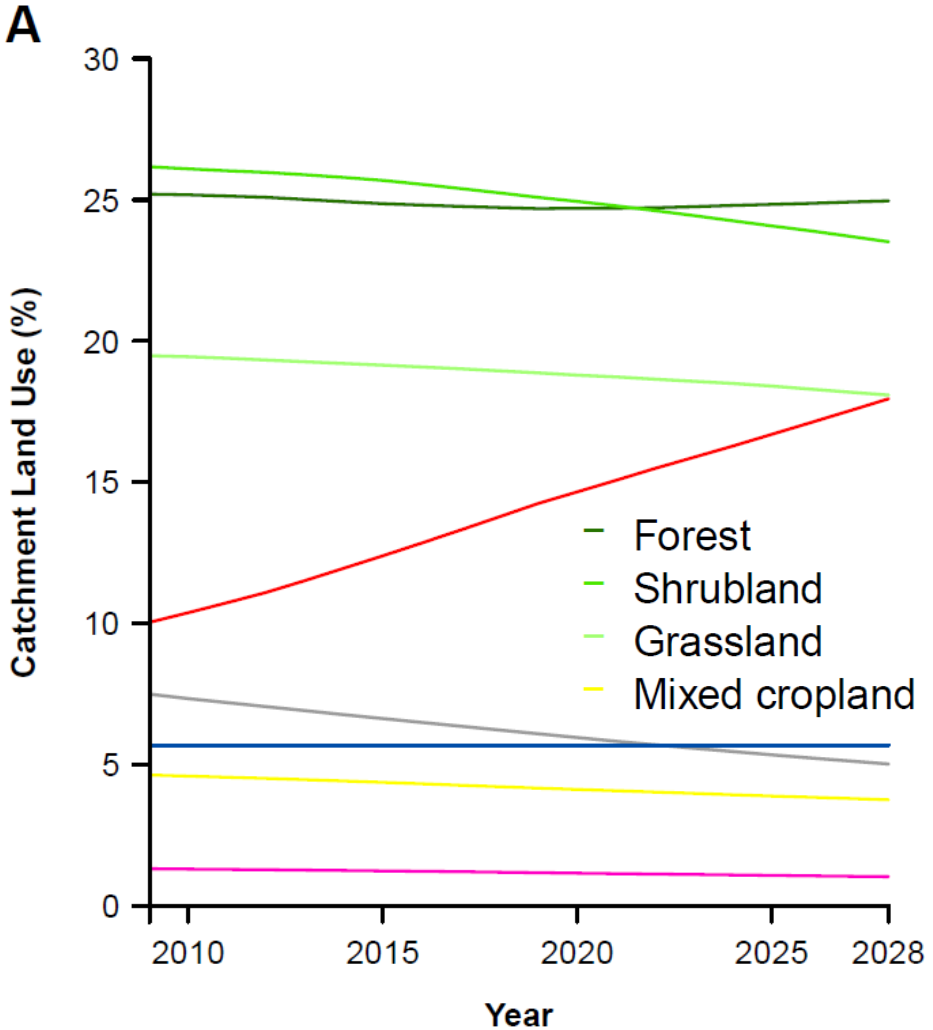


- |           |                |           |
|-----------|----------------|-----------|
| Forest    | Mixed Cropland | Bare Soil |
| Shrubland | Rice-Wheat     | Water     |
| Grassland | Sugarcane      | Urban     |



# 3. Land Use Scenarios

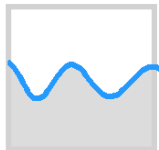
## linear



# 3. Model runs

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<b>Land use representation</b>	<b>Land use scenario</b>	<b>Model run abbreviation</b>
Static (2009/2010)	-	LU09
Static (2028/2029)	-	LU28
Dynamic (time step 1 yr)	linear	LU1S1
Dynamic (time step 1 yr)	non-linear	LU1S2
Dynamic (time step 3 yrs)	non-linear	LU3S2
Dynamic (time step 5 yrs)	non-linear	LU5S2
Dynamic (time step 9 yrs)	non-linear	LU9S2



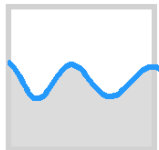
### 3. Land use change impact assessment

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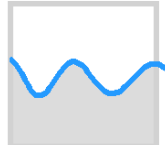
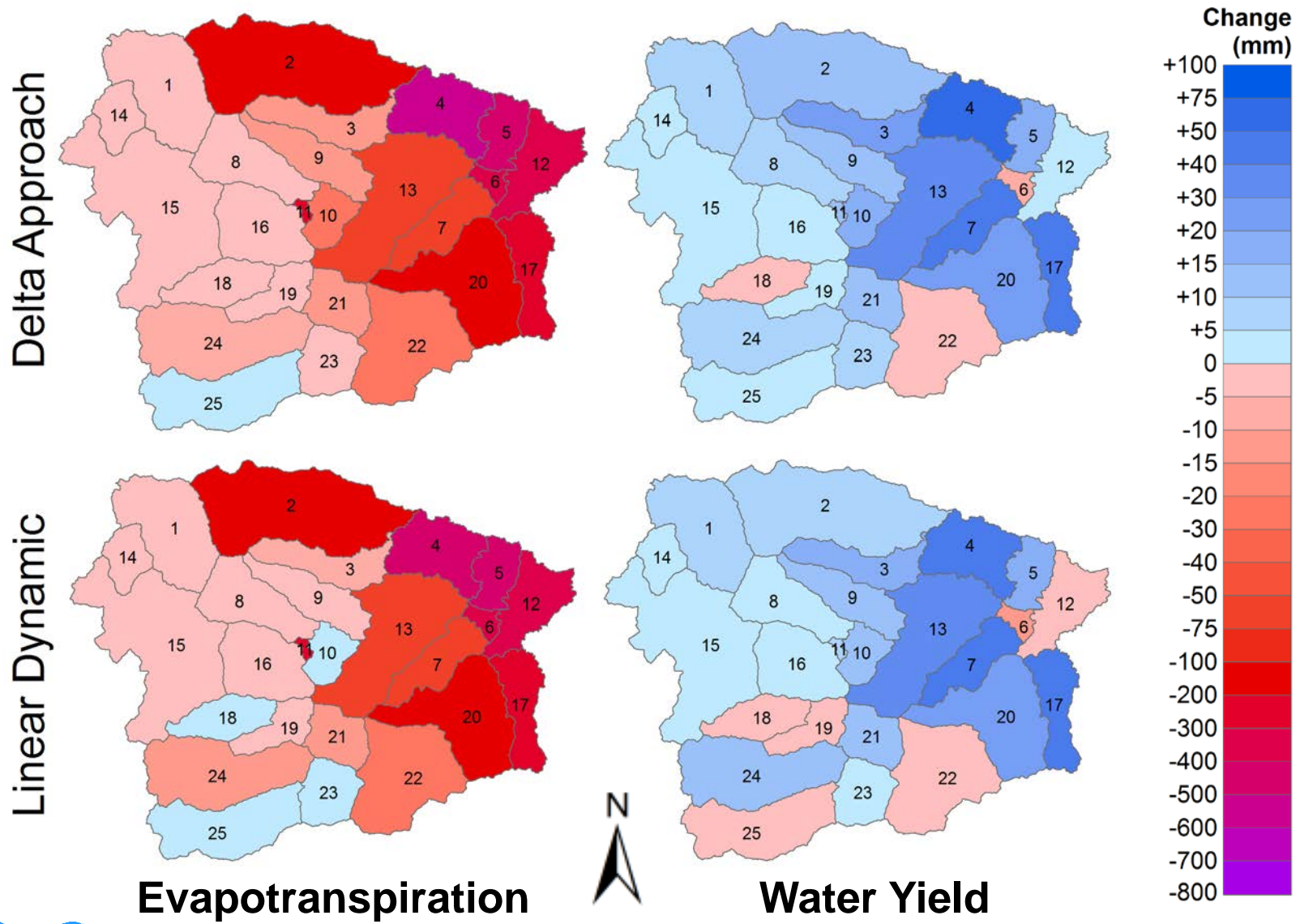
$$\textit{Delta Change} = \frac{V(LU28) - V(LU09)}{2}$$

$$\textit{Dynamic Change} = \sum_{i=2009}^{2028} [V(LUi) - V(LU09)]$$

where  $V(LU28)$ ,  $V(LU09)$ ,  $V(LUi)$  are the cumulative values of a water balance component  $V$  for the model runs  $LU28$ ,  $LU09$ , and  $LUi$  (for the period between the annual land use updates  $i$ ), respectively

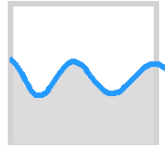
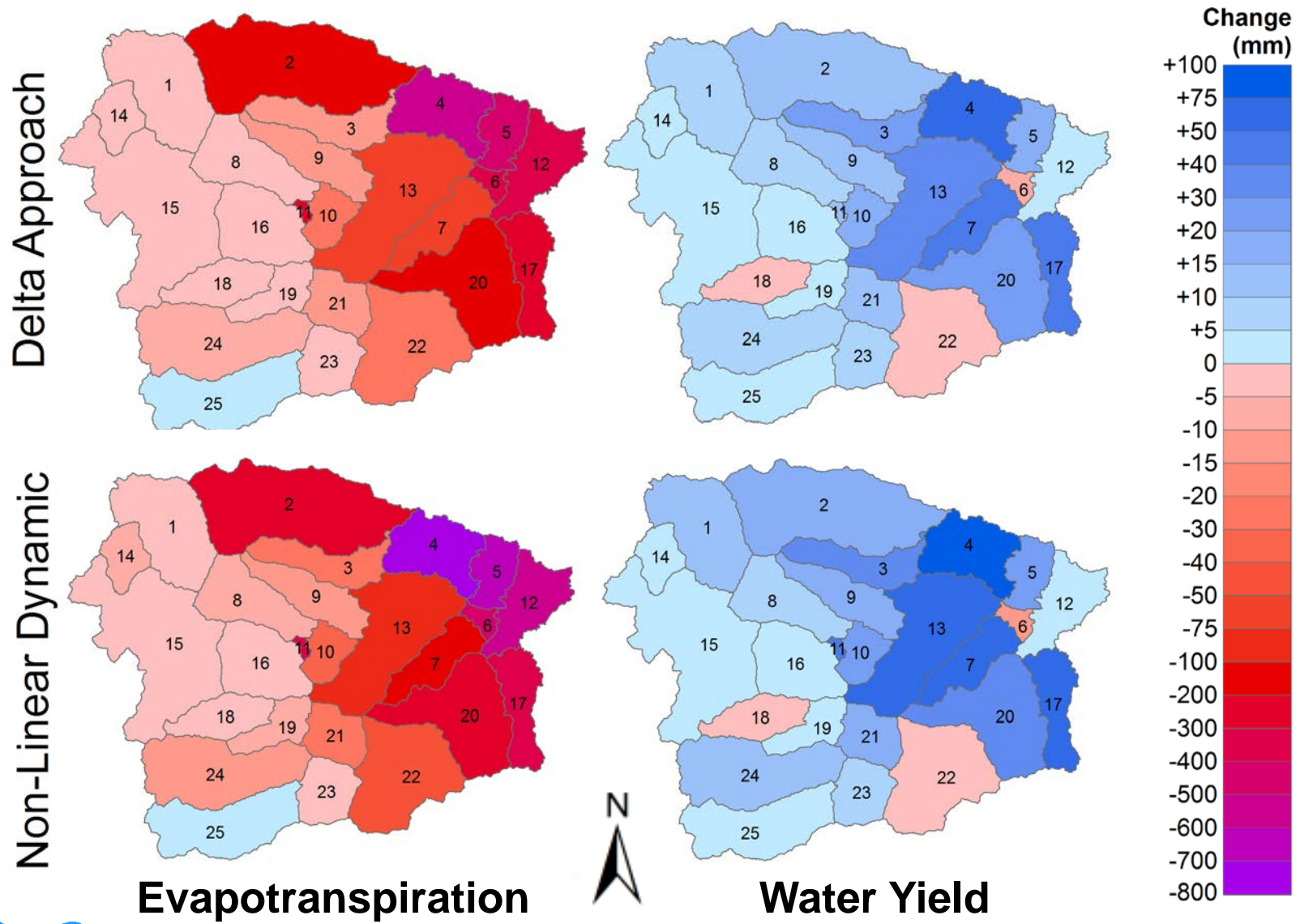


# 4. Cumulative land use change impacts

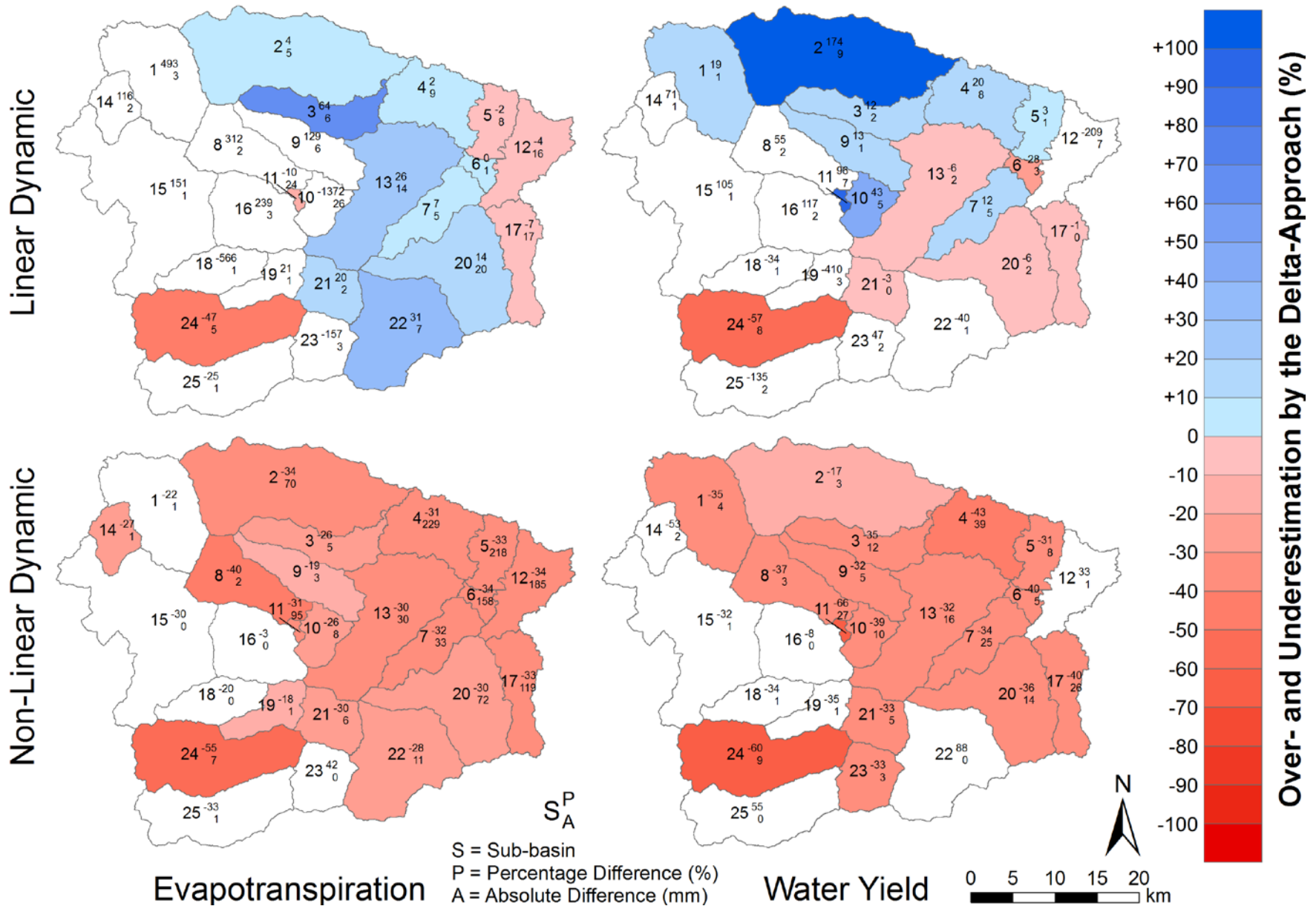




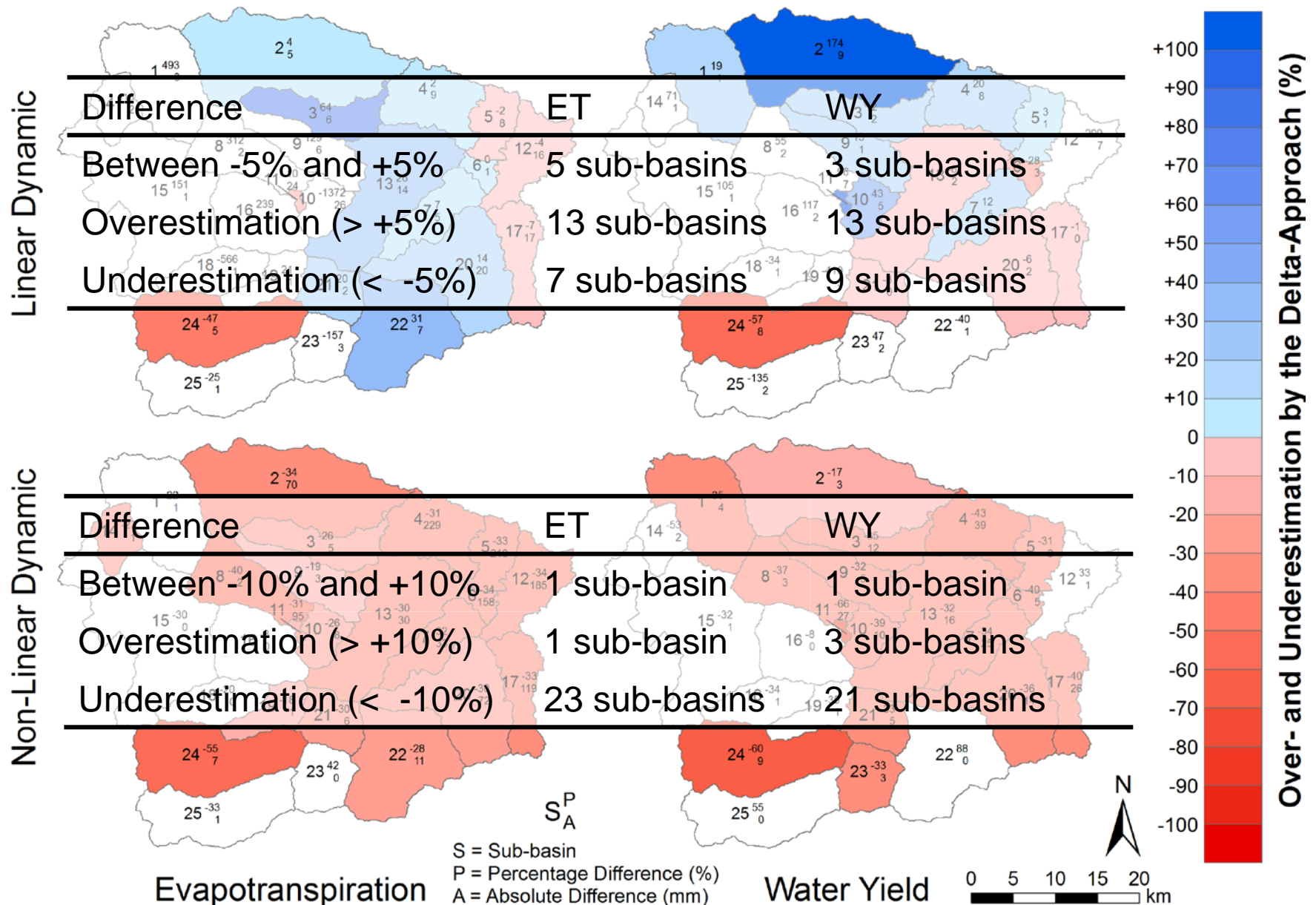
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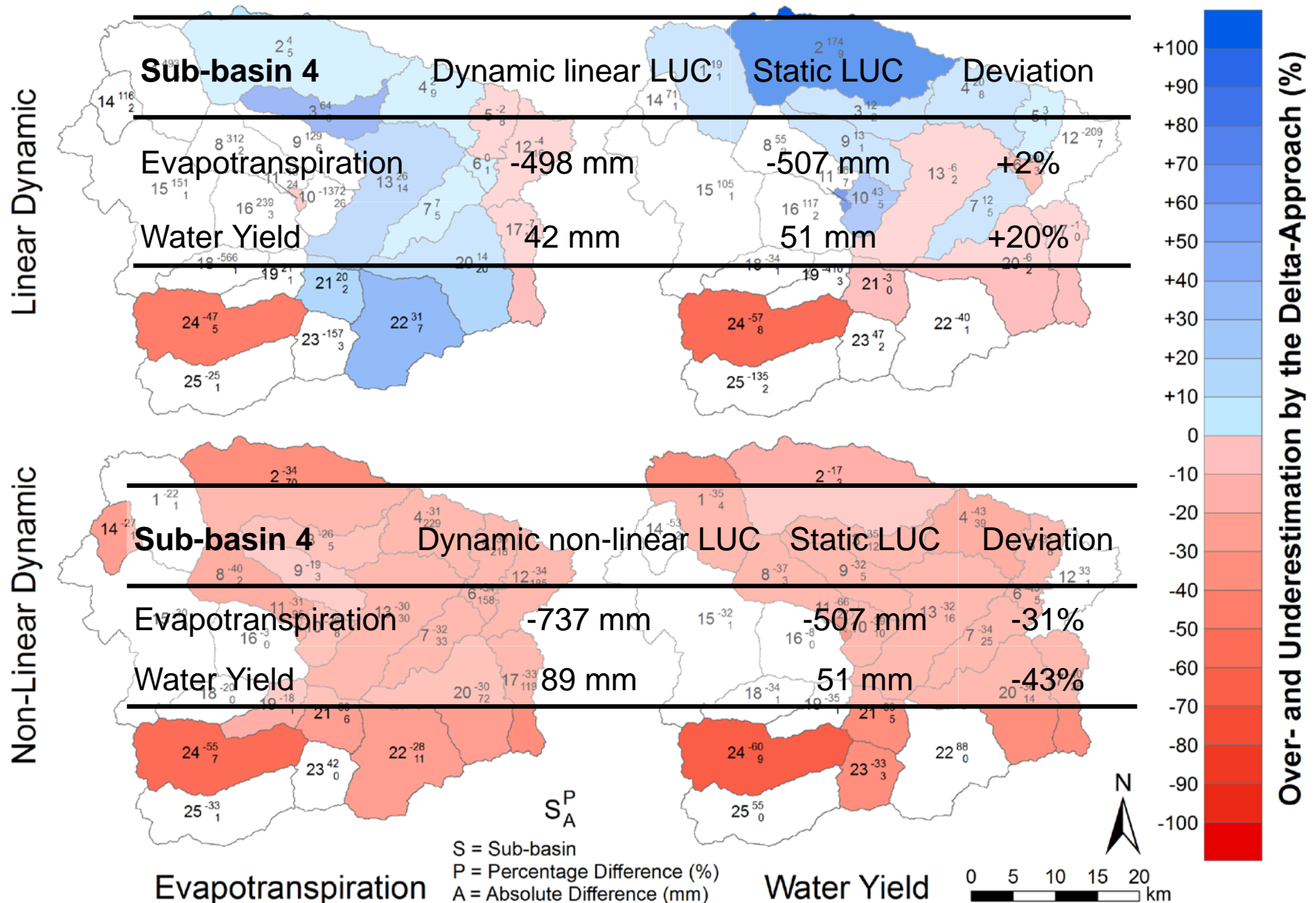
# 5. Approximation by the Delta-Approach



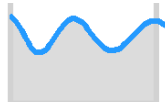
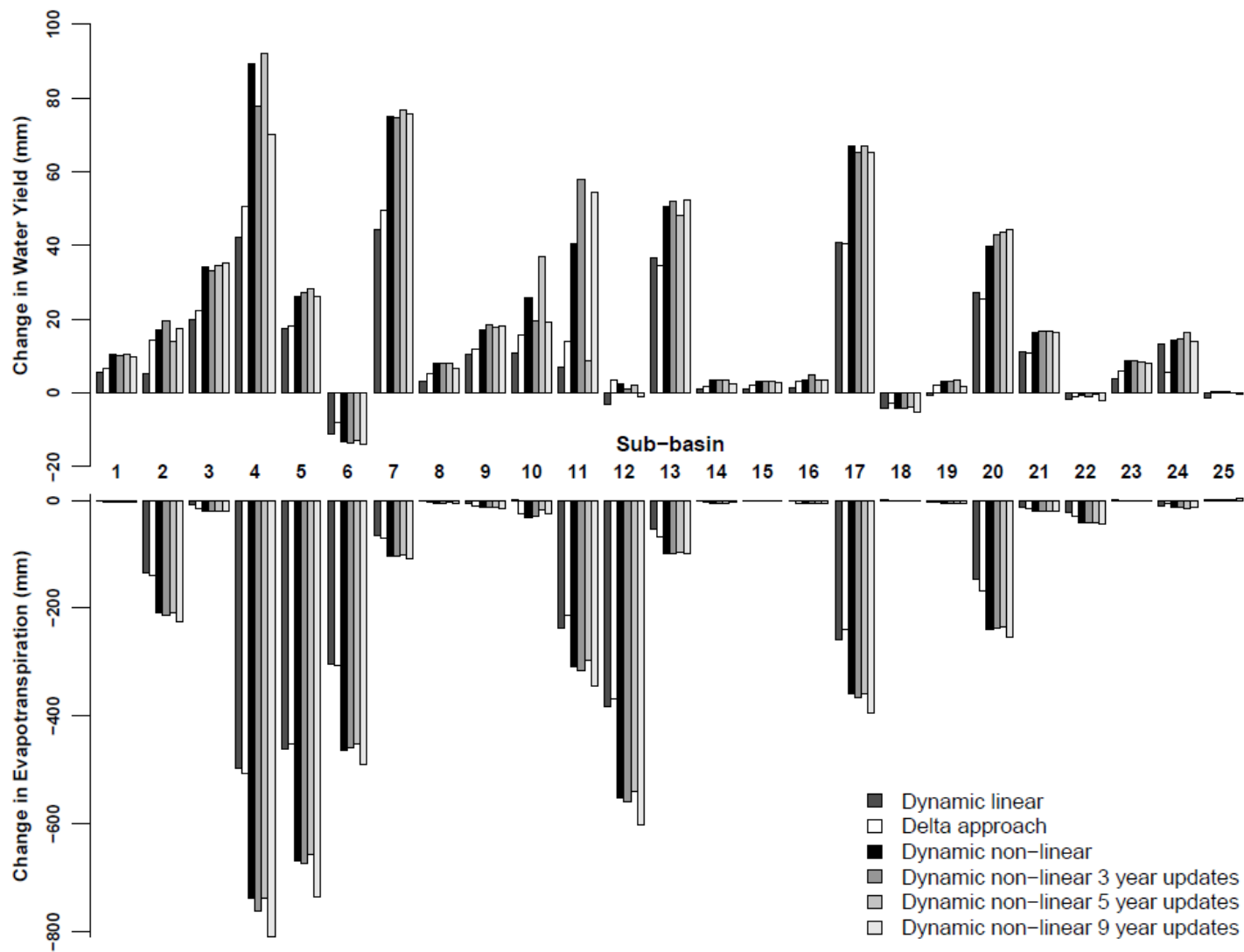
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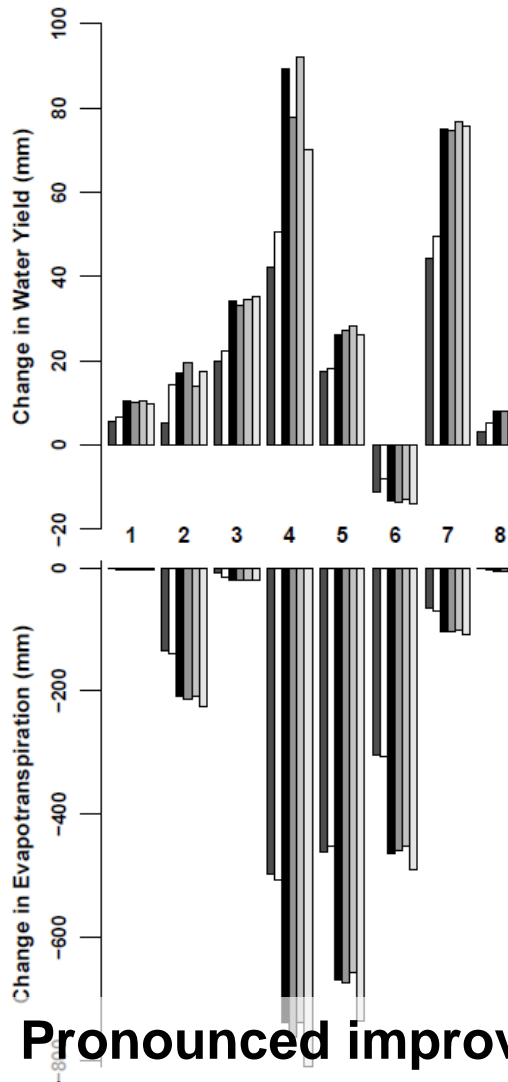
# 5. Approximation by the Delta-Approach



# 6. Land use update frequency



# 6. Land use update frequency



Approximation of dynamically assessed sub-basin water balance changes by the delta approach and coarser land use representations as indicated by mean absolute error (MAE), root mean square error (RMSE), and Nash-Sutcliffe efficiency (NSE).

Evapotranspiration	MAE	RMSE	NSE
Linear Scenario approx. by Delta	7.6	10.6	0.995
Non-linear Scenario approx. by Delta	50.3	88.3	0.844
Non-linear Scenario approx. by updates every 3 yrs	2.7	5.6	0.999
Non-linear Scenario approx. by updates every 5 yrs	3.0	5.5	0.999
Non-linear Scenario approx. by updates every 9 yrs	13.5	25.0	0.988

Water Yield	MAE	RMSE	NSE
Linear Scenario approx. by Delta	3.0	4.0	0.931
Non-linear Scenario approx. by Delta	8.9	13.5	0.722
Non-linear Scenario approx. by updates every 3 yrs	2.1	4.5	0.969
Non-linear Scenario approx. by updates every 5 yrs	2.6	6.9	0.927
Non-linear Scenario approx. by updates every 9 yrs	2.6	5.1	0.960

- Dynamic linear
- Delta approach
- Dynamic non-linear
- Dynamic non-linear 3 year updates
- Dynamic non-linear 5 year updates
- Dynamic non-linear 9 year updates

**Pronounced improvement by increasing the update frequency (5-9 years)**

# 7. Conclusions

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## **Dynamic land use integration yields more accurate predictions**

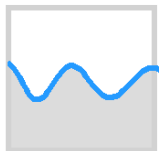
- *Water yield and ET are either underestimated or overestimated by the static delta approach in most sub-basins for both scenarios*

**Frequency of required land use information depends on the development rate of land use change**

**Non-linear land use change scenarios are hard to approximate with static land use change assessments**

**Land use information every five to nine years meant a pronounced improvement of prediction accuracy**

- Necessity of continuous land use monitoring in rapidly developing regions
- Use the SWAT land use update function



# ***Thank you very much!***

**More details:** Wagner et al. (2017): Comparing the effects of dynamic versus static representations of land use change in hydrologic impact assessments. *Environmental Modelling and Software*, accepted.

Thanks to my co-authors: **S. Murty Bhallamudi, Balaji Narasimhan, Shamita Kumar, Nicola Fohrer and Peter Fiener**

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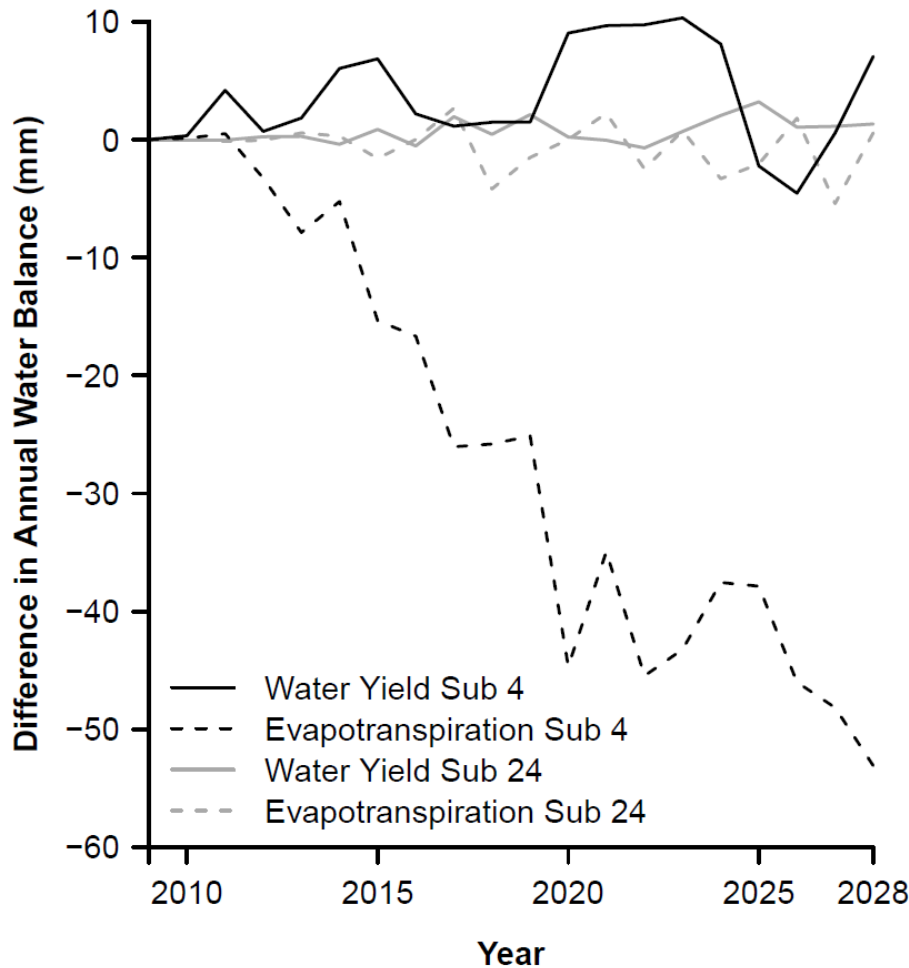
We are grateful to **IMD Pune, Water Resources Department Nashik, Khadakwasla Irrigation Division Pune, Groundwater Department Pune, Department of Agriculture Pune, NRSC Hyderabad, USGS and Earth System Science Interdisciplinary Center, University of Maryland and NASA/Goddard Space Flight Center** for supplying environmental data, good cooperation and discussions.





# 4. Land use change impacts

## Annual impacts of land use change



### Sub-basin 4 (urban fringe):

- Increase of water yield (surface sealing)
- Decrease of evapotranspiration (decrease of cropland)

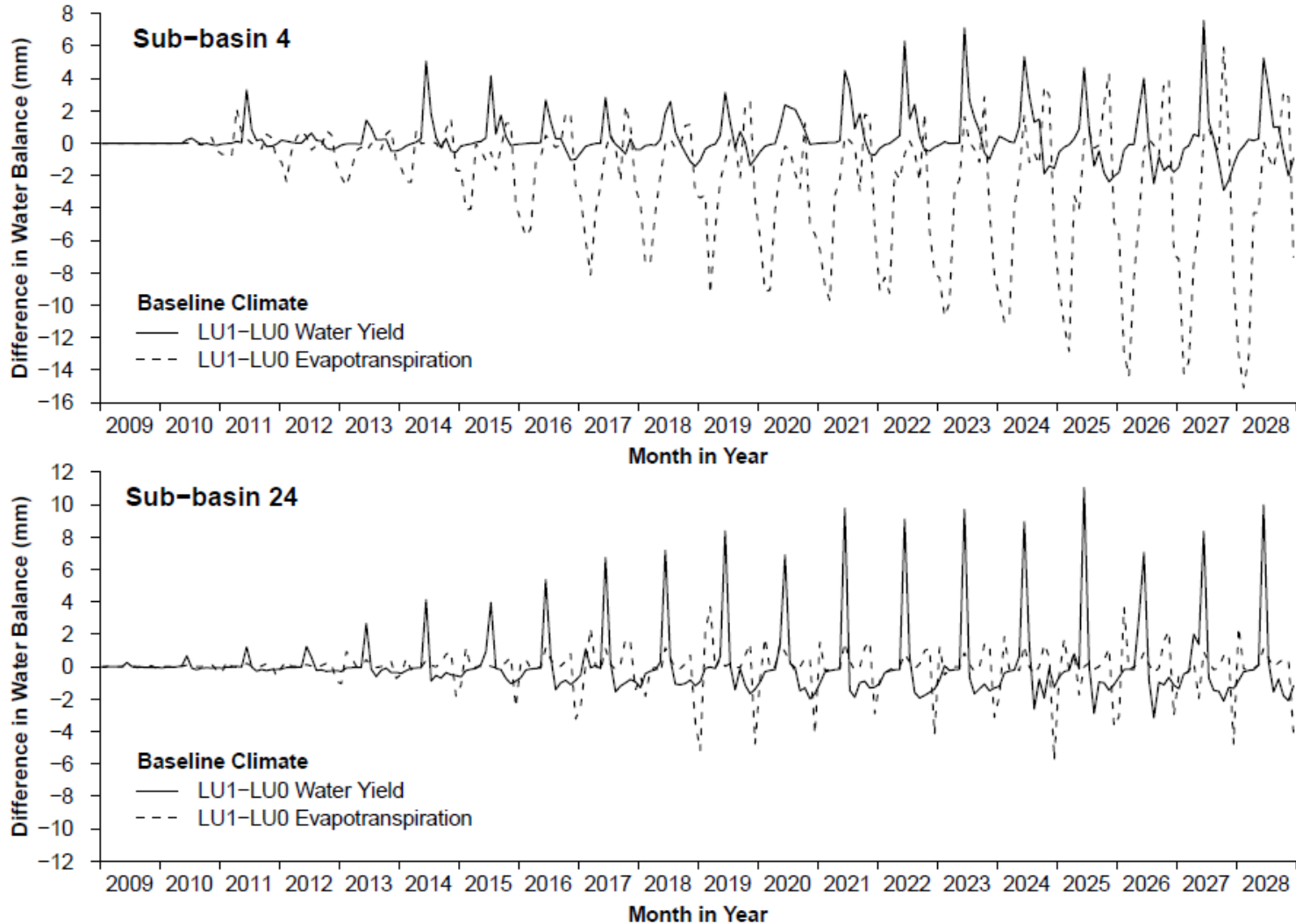
### Sub-basin 24 (Lavasa):

- Comparatively low impacts

Source: Wagner, P.D., S. Murty Bhallamudi, B. Narasimhan, L.N. Kantakumar, K.P. Sudheer, S. Kumar, K. Schneider, P. Fiener, 2016. Dynamic integration of land use changes in a hydrologic assessment of a rapidly developing Indian catchment. *Science of the Total Environment*, 539: 153-164.

# 4. Land use change impacts

## Impacts of land use change on the monthly time scale



Source: Wagner, P.D., S. Murty Bhallamudi, B. Narasimhan, L.N. Kantakumar, K.P. Sudheer, S. Kumar, K. Schneider, P. Fiener, 2016. Dynamic integration of land use changes in a hydrologic assessment of a rapidly developing Indian catchment. *Science of the Total Environment*, 539: 153-164.