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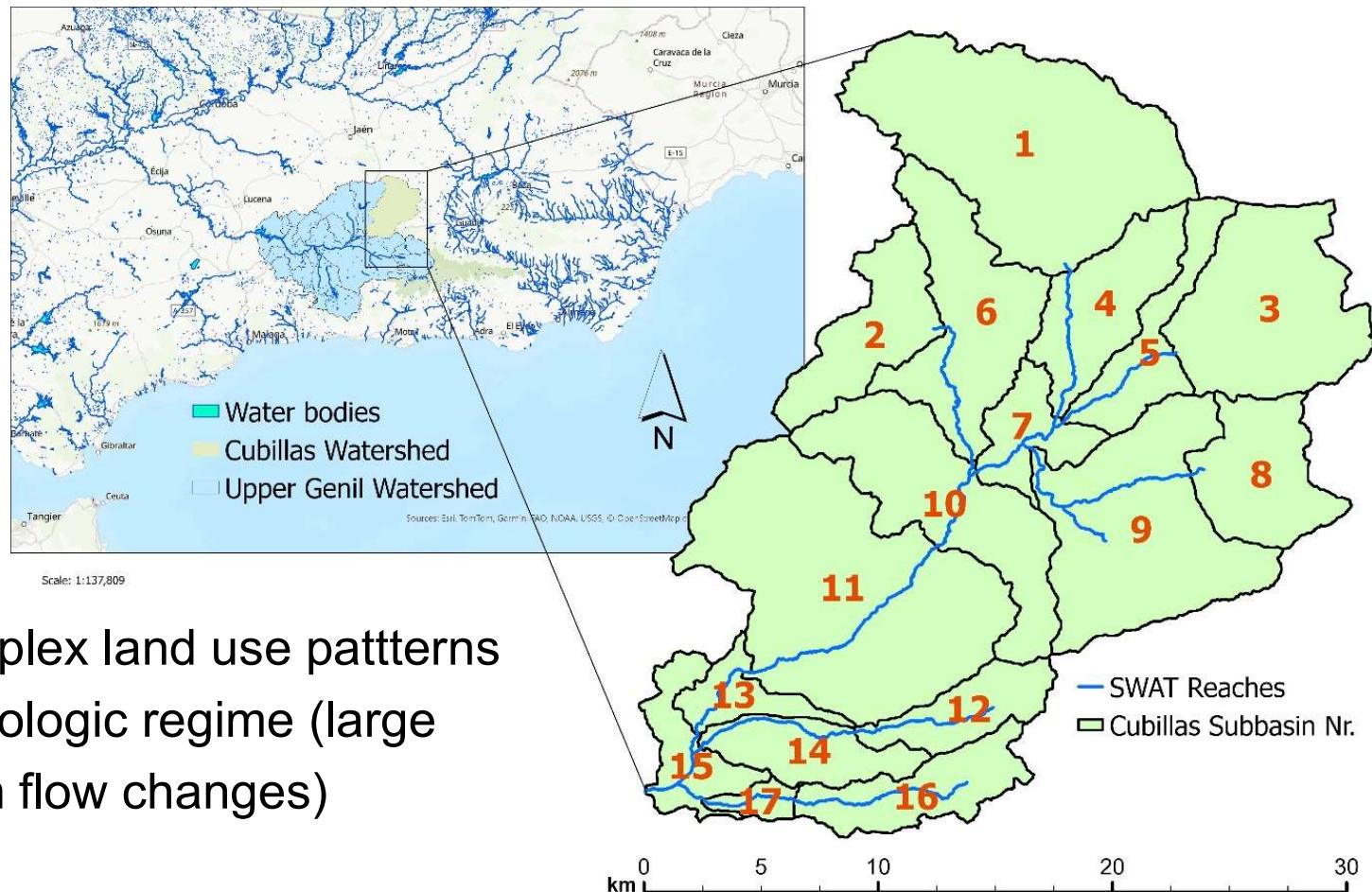
Point- vs. diffuse-source pollution

Uncertainty-aware attribution analysis in Mediterranean agricultural river basins with sparse water quality data

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Upper-Genil & Cubillas River Basins

- Water quality in mediterranean river networks is highly variable in time and space.
- Point (weakly variable) and non-point (highly variable) sources
- Cubillas sub-basin: complex land use patterns and mediterranean hydrologic regime (large seasonal and short-term flow changes)

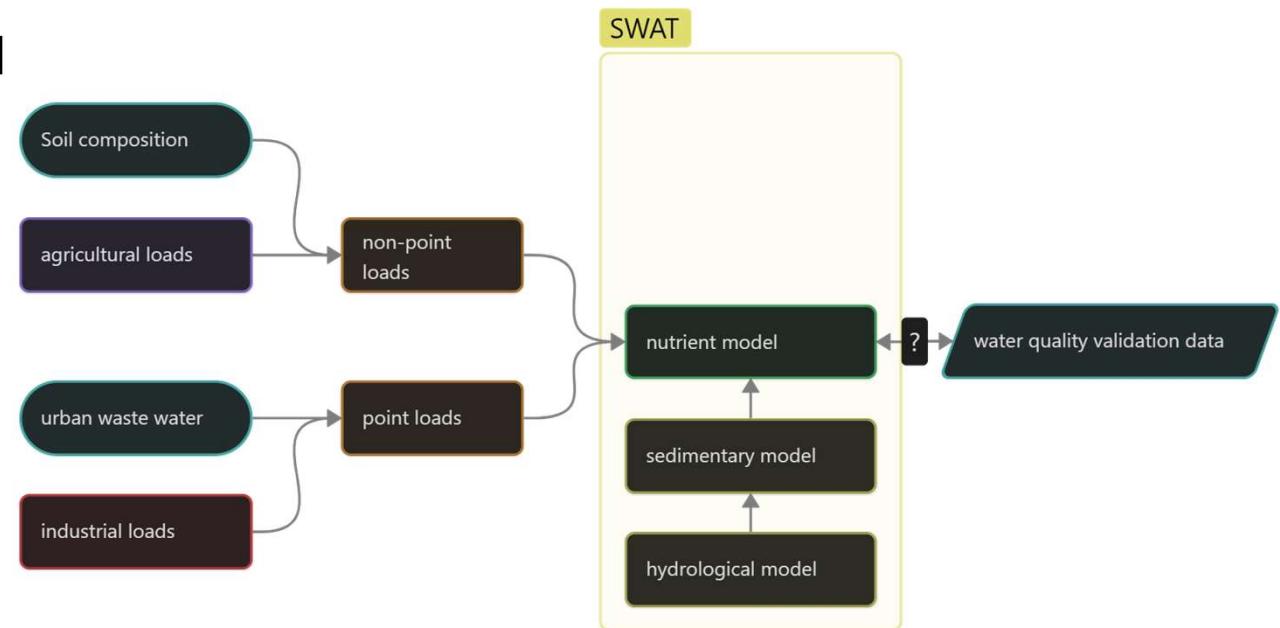


Goals

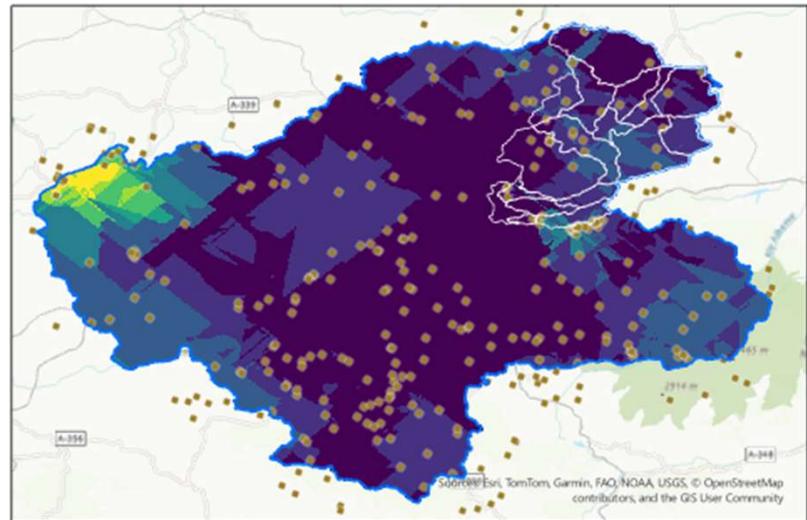
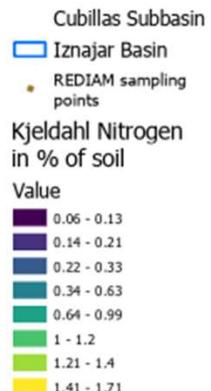
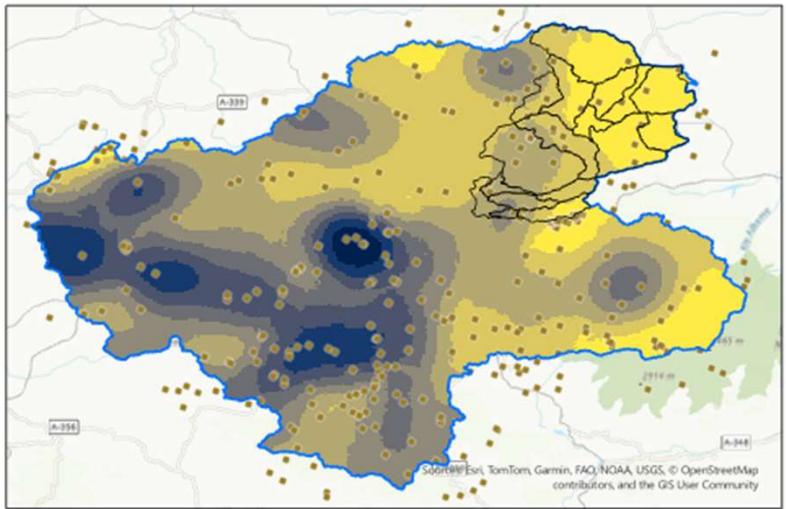
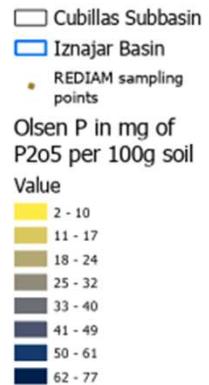
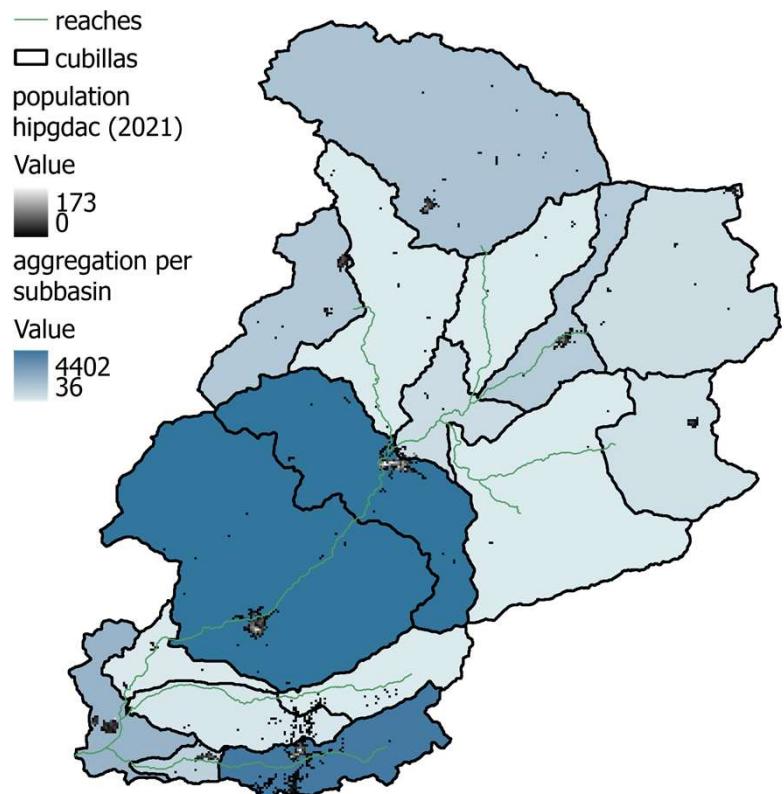
- 1) How sensitive are SWAT outputs in Cubillas basin to changes in soil organic matter and nutrient content, and to the magnitude of urban wastewater loads?
- 2) To what extend the ranges of uncertainty in these sources can explain observed water quality variable in Cubillas river??

SWAT: Model background

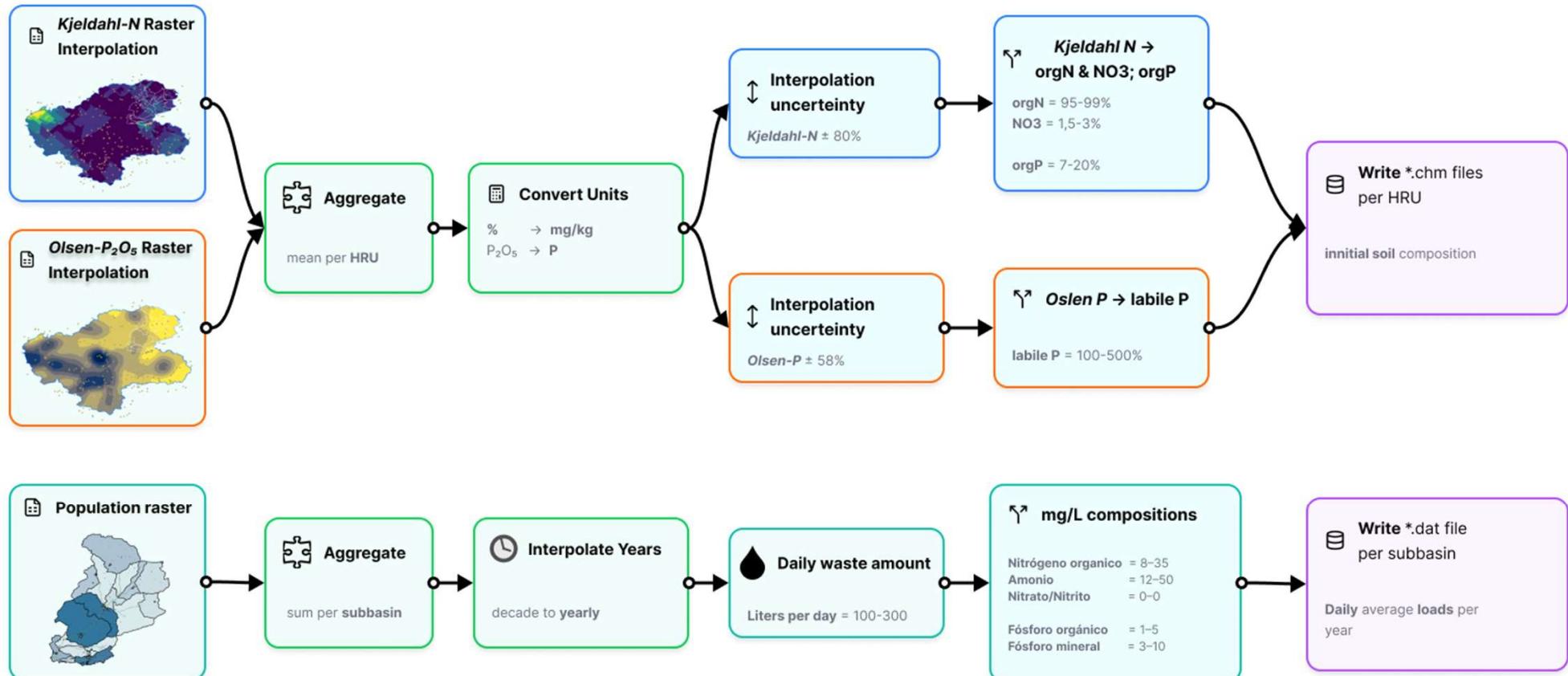
- ▶ Watershed and erosion model
- ▶ Nutrient fluxes and pathways
- ▶ **Point vs. non-point sources**
 - ▶ **Non-point: soil initial conditions**
 - ▶ **Point: urban wastewater**



Soil databases



Sources of uncertainty



Ensembles of model realizations

Scenario	Description
BASE	Hydrologic/sediment model (calibración “219”) + land uses
WASTE (point)	BASE + urban wastewater (<i>min–max ensembles</i>)
SOIL (non-point)	BASE + initial soil nutrient content (<i>min–max ensembles</i>)
WASTE+SOIL	BASE + WASTE + SOIL (<i>min–max ensembles</i>)

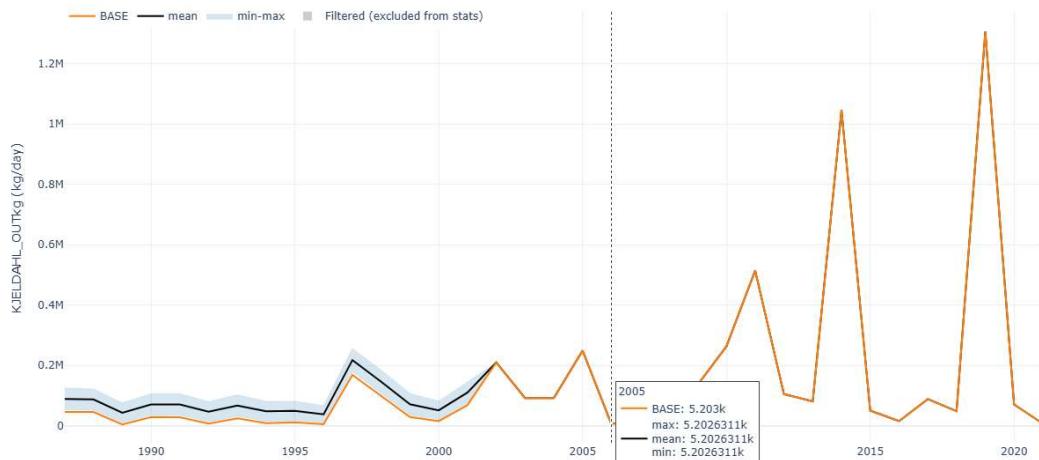
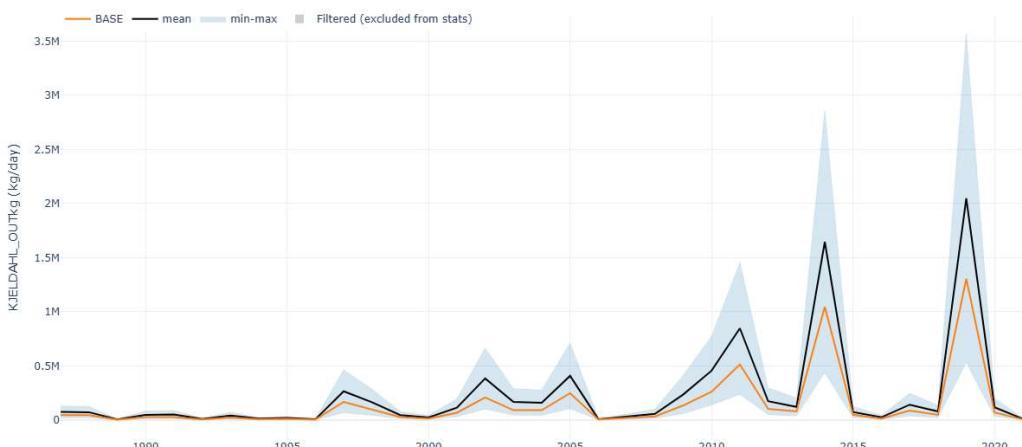
Storm events: periods of at least 2 days when flow rate is \geq 75-percentile

Sensitivity tests

WASTE

► Annual average Kjeldahl N

SOIL



- BASE vs. WASTE
 - Purely additive loads
- BASE vs. SOIL
 - compare the default (automatic) soil initialization procedures in SWAT vs. manual or data-driven procedures

Sensitivity tests

- ▶ Total Phosphorus (TP)
- ▶ Kjeldahl Nitrogen (TKN)

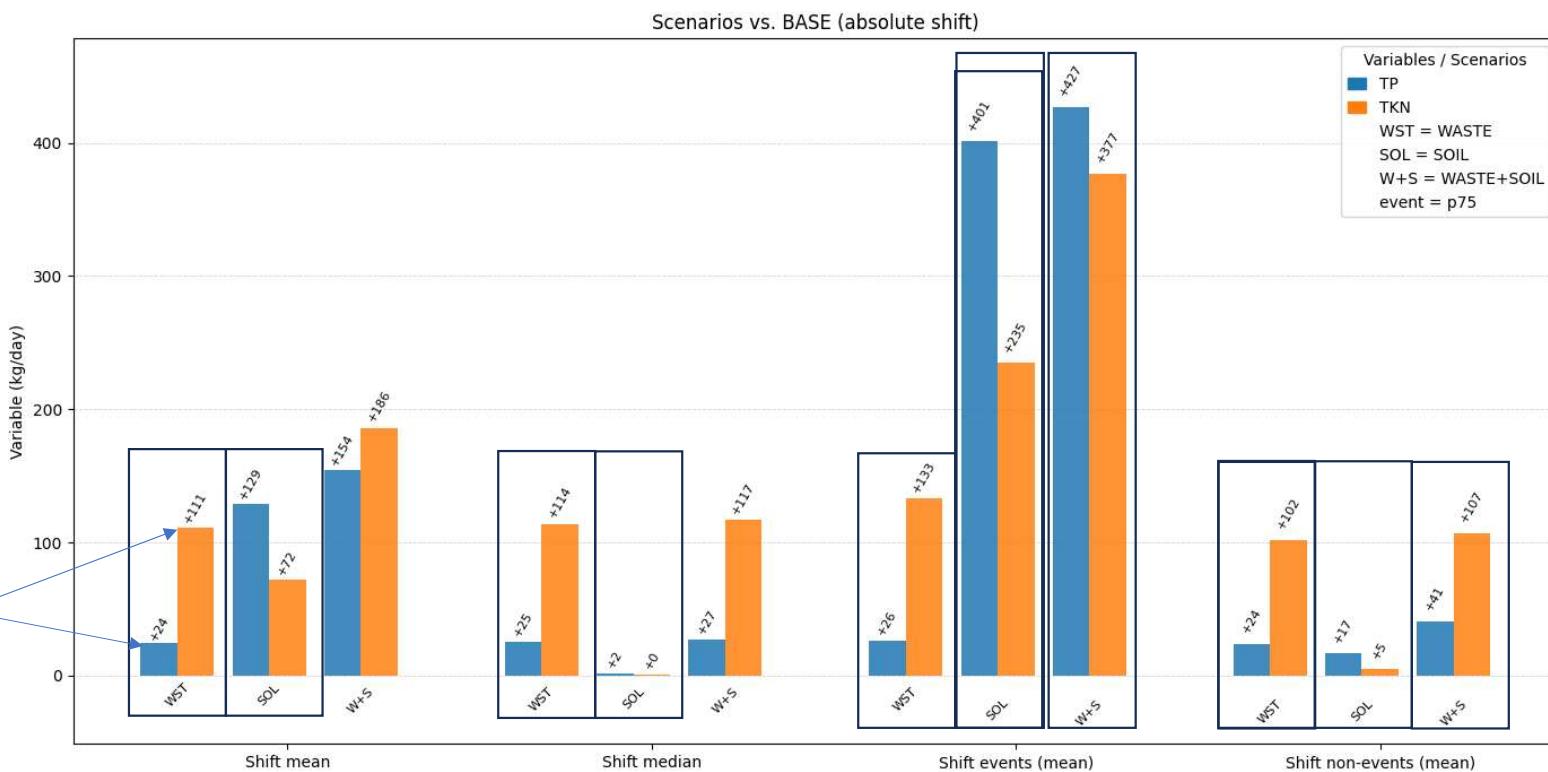
$$M_{\square} = N \cdot L \cdot c_{\square} \cdot 10^{-6}$$

$$M_{TP} = 15,500 \cdot 200 \cdot 8 \cdot 10^{-6}$$

$$M_{TP} = 24.8 \text{ kg/day}$$

$$M_{TKN} = 15,500 \cdot 200 \cdot 40 \cdot 10^{-6}$$

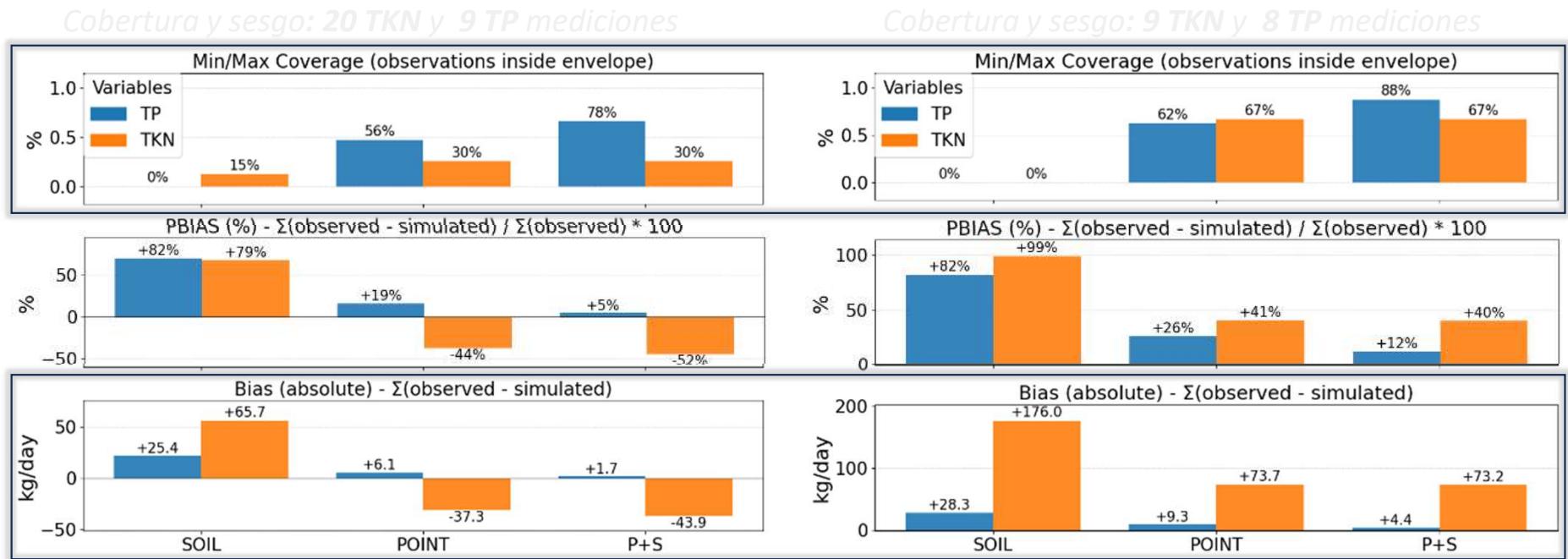
$$M_{TKN} = 124 \text{ kg/day}$$



Observations and model uncertainty ranges

Filtering observations

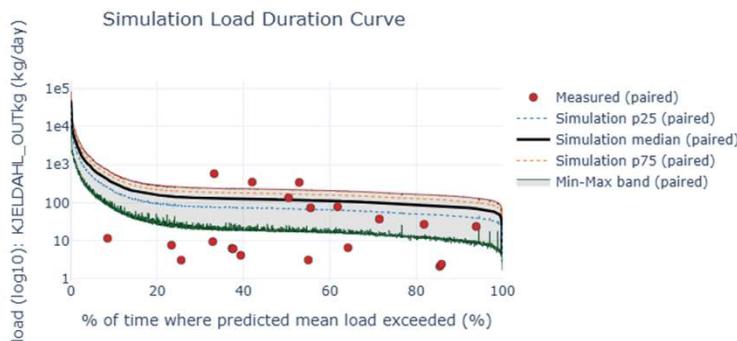
- 1) $LDM = 0.1 \text{ mg/kg}$
 - Set LDM to half LDM
- 2) only data $> LDM$
 - Much less



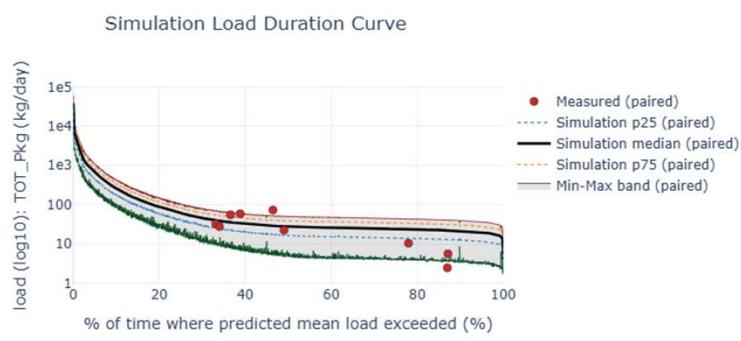
Observations and model uncertainty ranges

With values below LDM

Kjeldahl Nitrogen

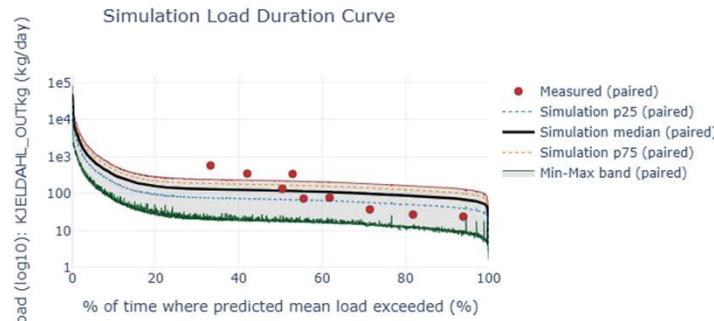


Total Phosphorus

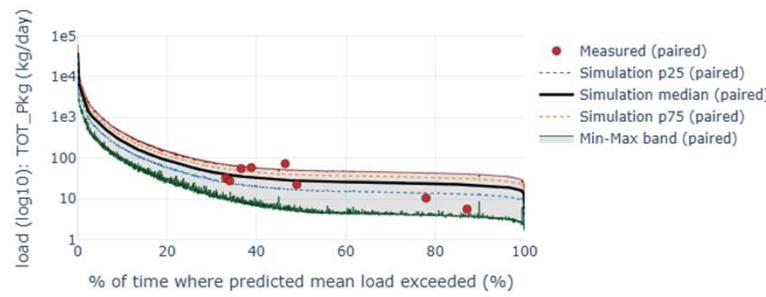


With no values below LDM

Kjeldahl Nitrogen



Total Phosphorus



Discussion

Attribution

- ▶ TP more sensitivity to soil initialization procedures and number of events/year [1]
- ▶ TKN more sensitive to urban wastewater loadings (consistent with input)

Water quality model, needs to be improved (for daily loads)

- ▶ Need to account for wastewater loads + soil initialization uncertainty so that observed are within uncertainty ranges
 - ▶ TP with/without data < LDM: coverage ~ 80%; underestimating 2-4 kg/day
 - ▶ TKN with data < LDM: coverage 30%; overestimating - 44 kg/day
 - ▶ TKN without data < LDM: coverage 67%; underestimating 73 kg/day

[1] H. K. M. Mihiranga et al., “Nitrogen/phosphorus behavior traits and implications during storm events in a semi-arid mountainous watershed,” 2021.

Conclusions

- ▶ Soils, per-se, have a limited explanatory potential
 - ▶ For non-point sources: focus on uncertainties resulting from agricultural management
- ▶ Mas falta de atribución para Nitrógeno que para Fosforo [2]
- ▶ **Global Warming= ↑ affecting non-point sources** [3,4]
- ▶ Need to **identify** additional sources of uncertainty (structural and data)
- ▶ Need to more-comparable data, particularly, during events.
- ▶ **Need for clear protocols to deal with values < LDM (key)**

[2] O. US EPA, “Nonpoint Source Pollution with Nitrogen and Phosphorus.” 1998. pdf:
<http://www.esa.org/esa/wp-content/uploads/2013/03/issue3.pdf>

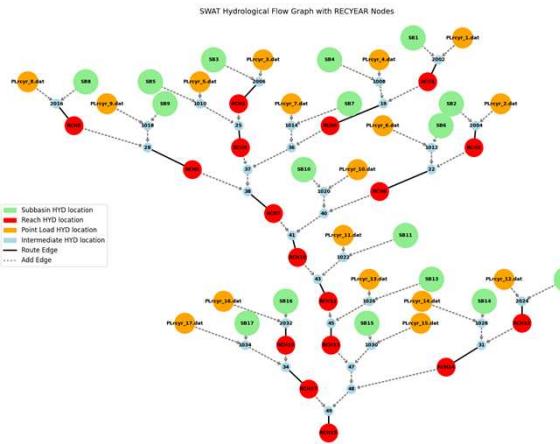
[3] T. Johnson *et al.*, “A review of climate change effects on practices for mitigating water quality impacts,” 2022, doi: [10.2166/wcc.2022.363](https://doi.org/10.2166/wcc.2022.363).

[4] J. Ide *et al.*, “Impacts of Hydrological Changes on Nutrient Transport From Diffuse Sources in a Rural River Basin, Western Japan,” 2019, doi: [10.1029/2018JG004513](https://doi.org/10.1029/2018JG004513).

Discussion

- ~10.000 Python lines, fairly complex but shared ...
https://github.com/bvorak/swat_pipeline
 - transparent, automatable and extendable
- Use it in server for MonteCarlo simulations
- Extended calibration will improve the method [4]

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    ]},  
  
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    ]},  
  
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    ]},
```



[4] C. Schürz et al., “A sensitivity and uncertainty analysis for discharge and nitrate-nitrogen loads under future changing conditions,” 2019, doi: [10.5194/hess-23-1211-2019](https://doi.org/10.5194/hess-23-1211-2019)

✓ TRABAJOFM
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 > .venv
 > config
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 02_build_inputs.ipynb
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 read_MDA.ipynb
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 point_utils.py
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 chm_writer.py
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 dashboard_helper.py
 > dashboard.py
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 mc_engine.py
 mc_spec.py
 provenance_report.py
 provenance.py
 raster_agg.py
 rch_parser.py
 realization_id.py
 realizations.py