



**EARTH &
ENVIRONMENTAL
SCIENCES**

Ecosystem responses to favorable weather conditions modulates decadal water use efficiency trends

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Plant Water Use Efficiency (WUE)

Leaf-scale

$$A = g_s(c_a - c_i)$$

$$E = g_s(v_i - v_a)$$

- water-use efficiency

$$WUE_i = \frac{A}{E} = \frac{A}{g_s(v_i - v_a)}$$

- **Intrinsic** water-use efficiency

$$WUE_i = WUE * (v_i - v_a) = \frac{A}{g_s}$$

Ecosystem-scale

$$A \rightarrow GPP$$

$$E \rightarrow ET$$

water-use efficiency

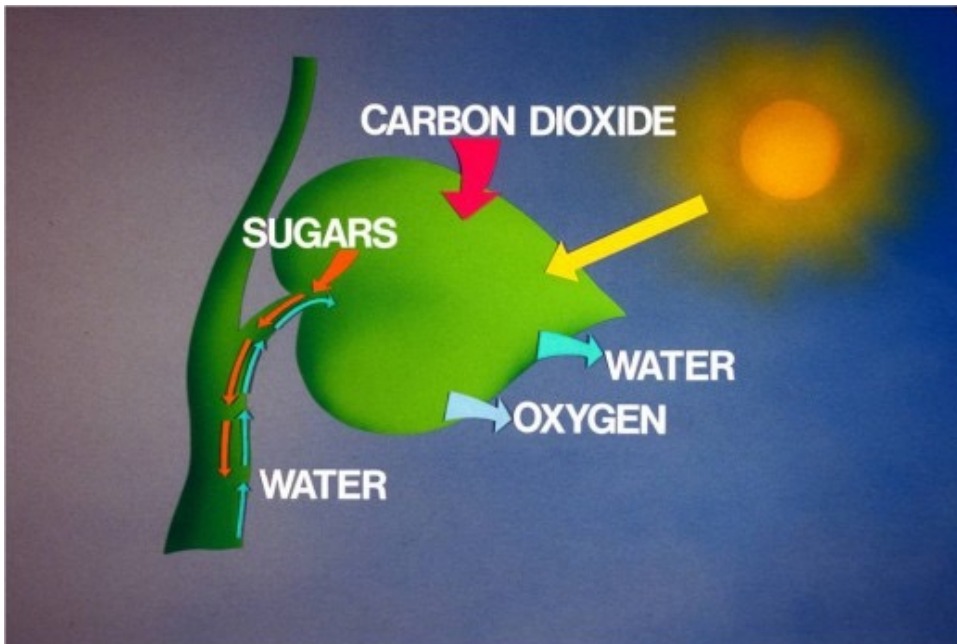
$$WUE^* = \frac{GPP}{ET}$$

- **Inherent** water-use efficiency

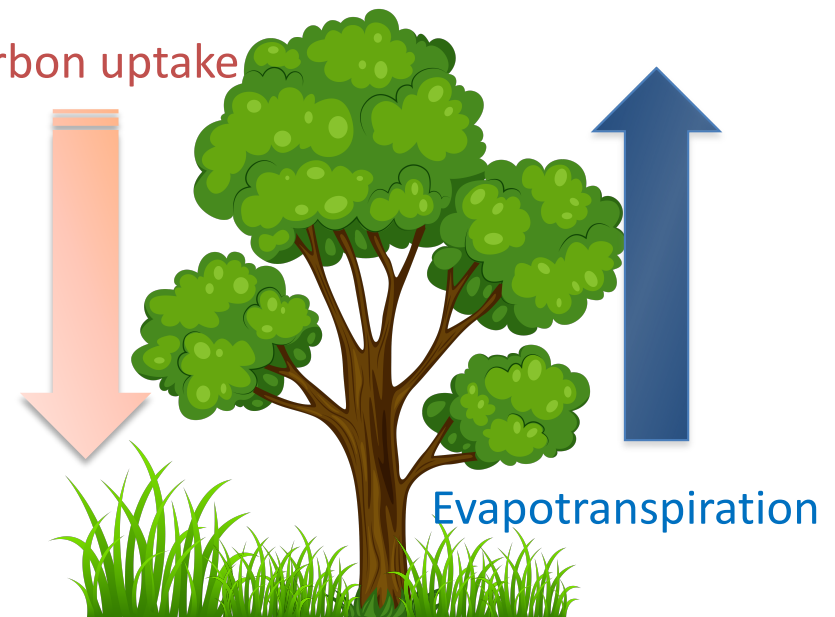
$$WUE_{ei} = \frac{GPP}{ET} * VPD$$

- **Underlying** water-use efficiency

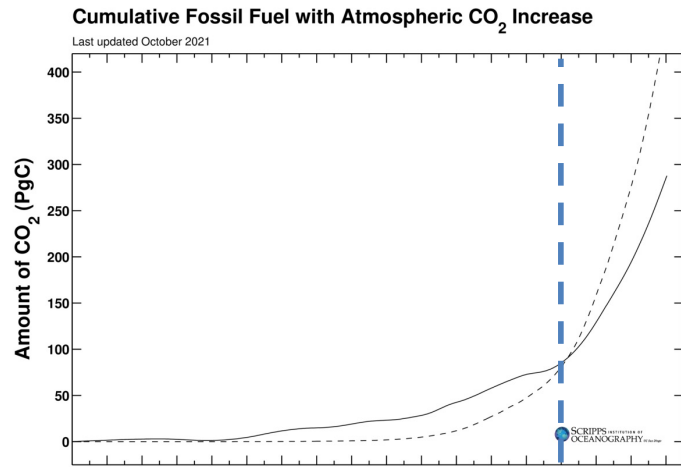
$$WUE_u = \frac{GPP}{ET} * \sqrt{VPD}$$



Carbon uptake

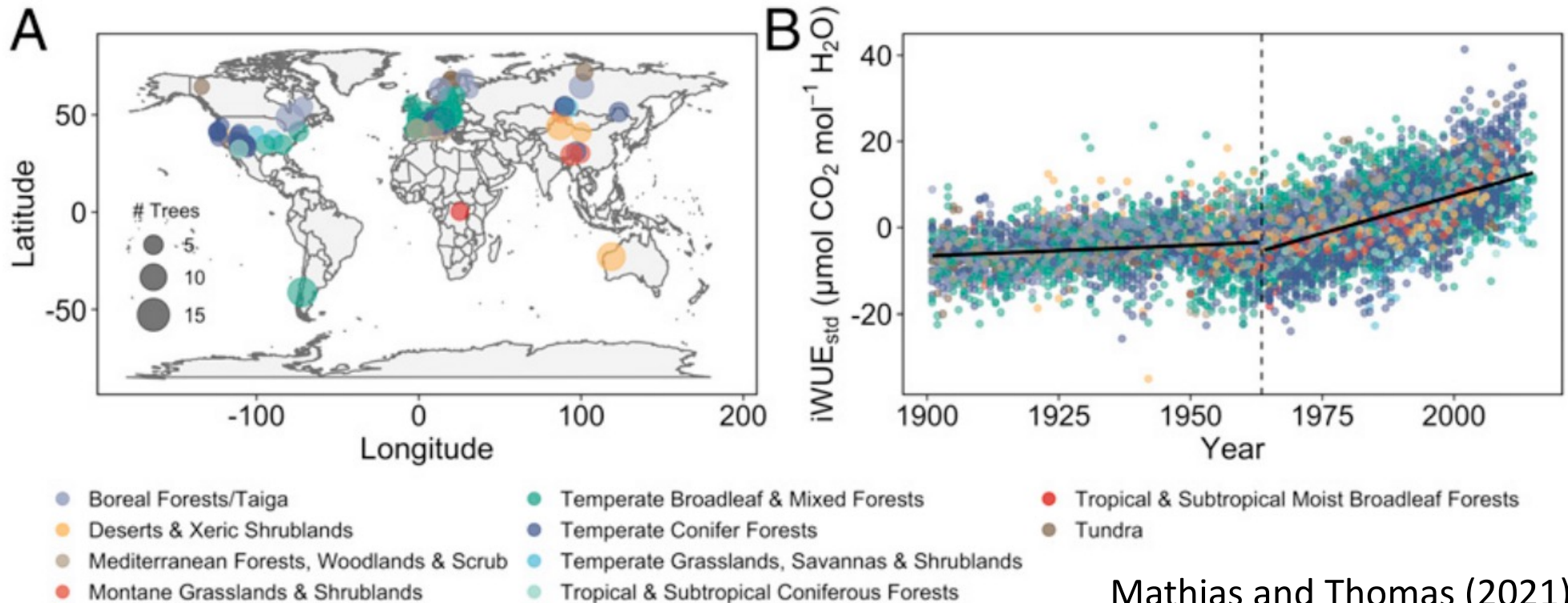


WUE changes over the past decades



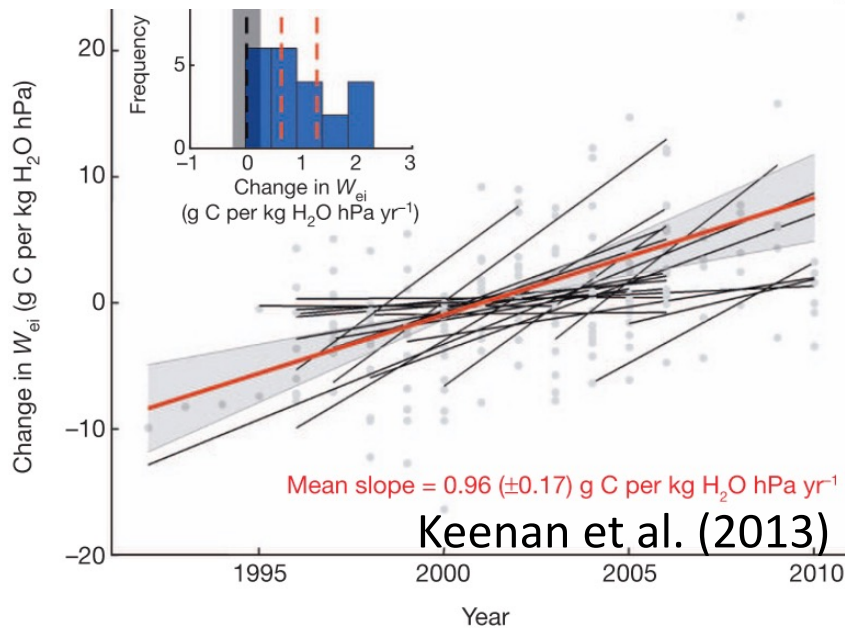
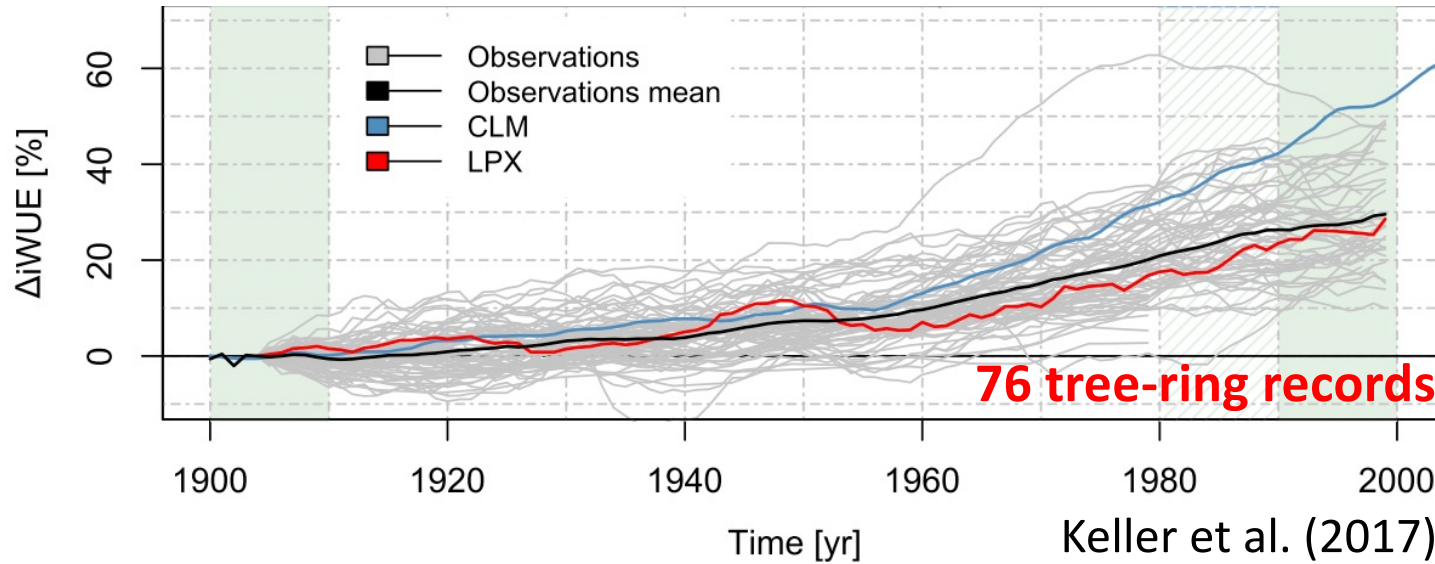
$$WUE \propto \left[\frac{A}{g_s} \right] \frac{GPP}{ET}$$

~40% increase in *iWUE* globally over the 20th century, coinciding with a ~34% increase in atmospheric CO₂ (36 species, 84 sites, 113 trees)



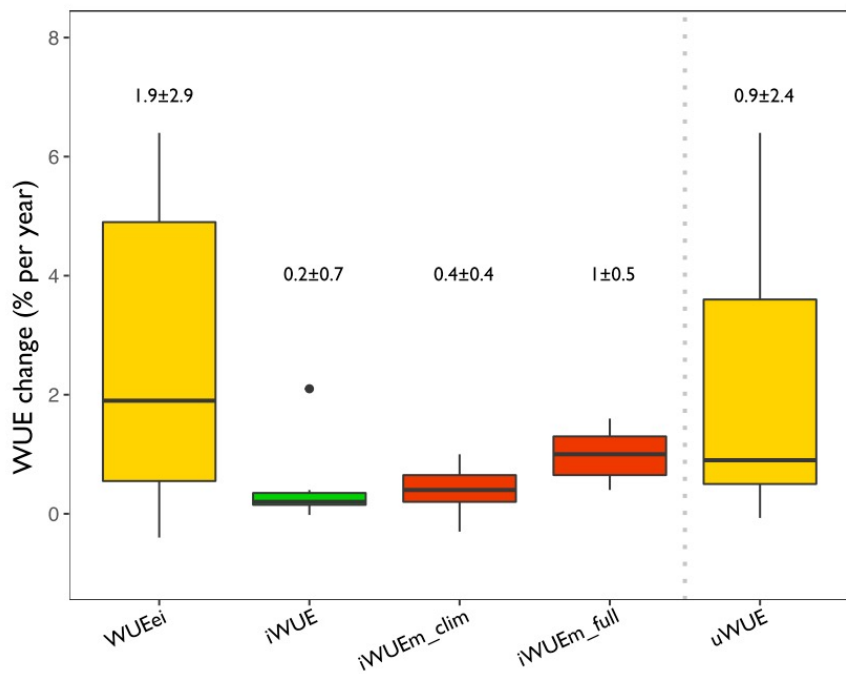
Mathias and Thomas (2021)

WUE changes over the past decades

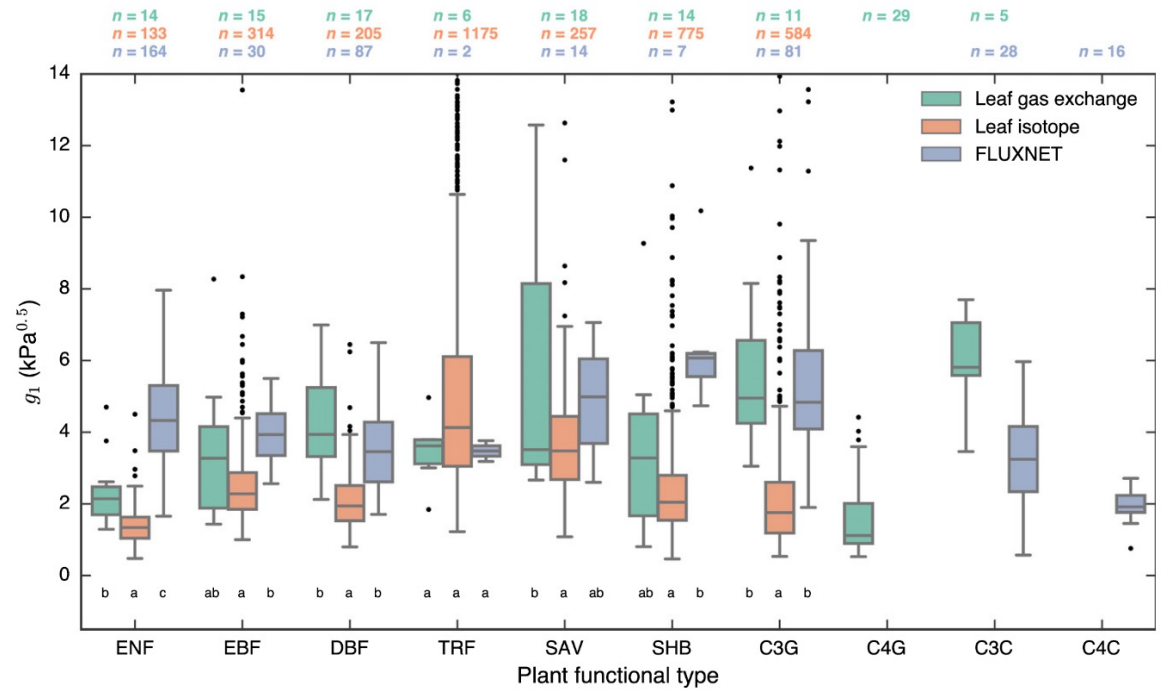


$\sim 2.3\% \text{ yr}^{-1}$ increase in ecosystem-scale WUE_{ei}

The mismatch is not just about spatial heterogeneity

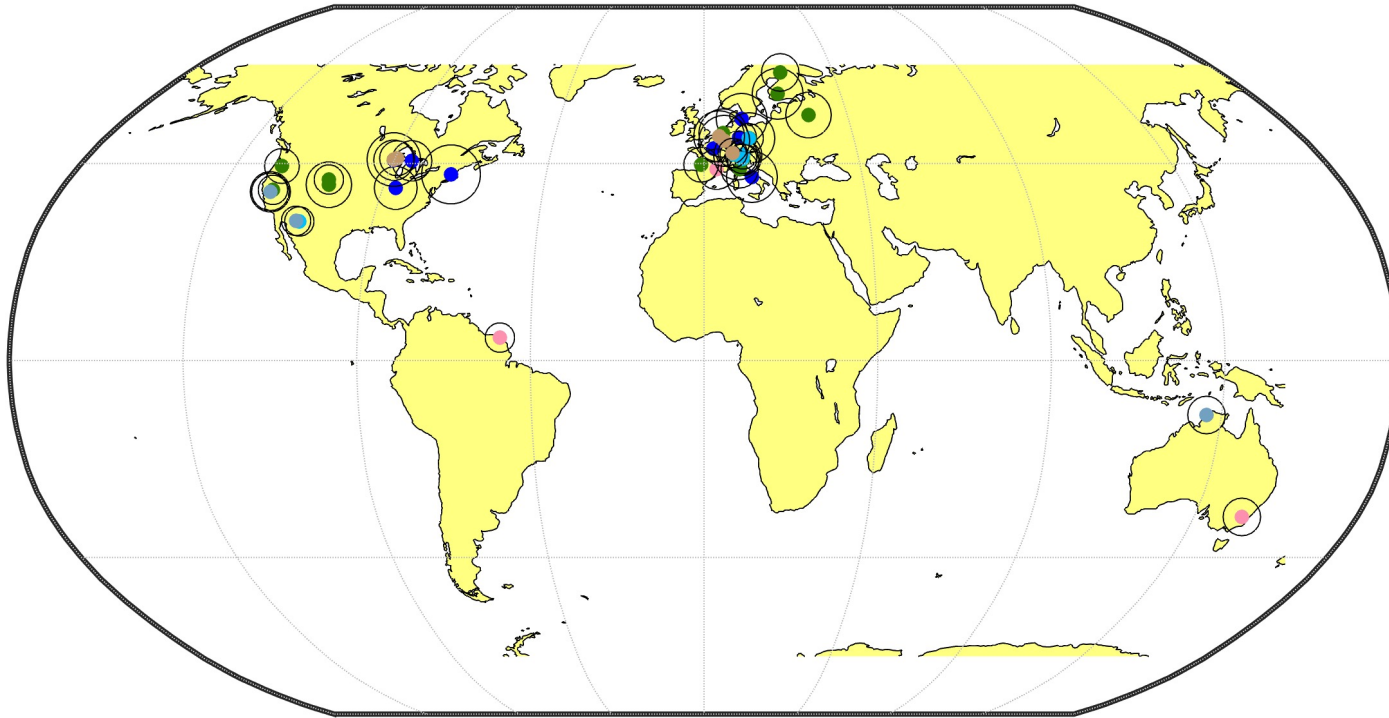


Guerrieri et al. (2019)



Medlyn et al. (2017)

WUE calculation



Underlying water-use efficiency

$$uWUE = \frac{GPP}{ET} * \sqrt{VPD}$$

- DBF
- EBF
- ENF
- GRA
- MF
- WSA

Each **hour** $uWUE_{hour} = \frac{GPP_{hour}}{ET_{hour}} * \sqrt{VPD_{hour}}$

Each **season**

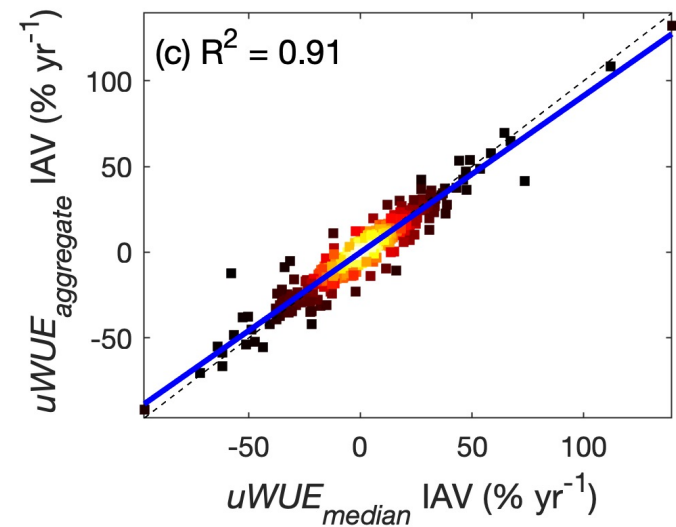
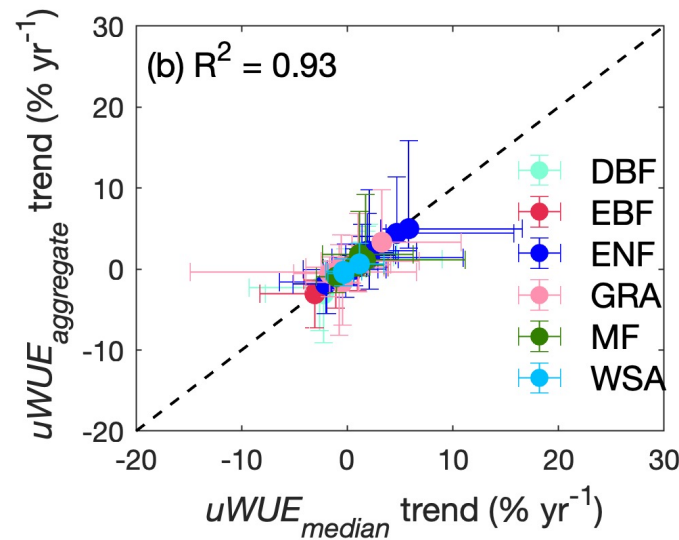
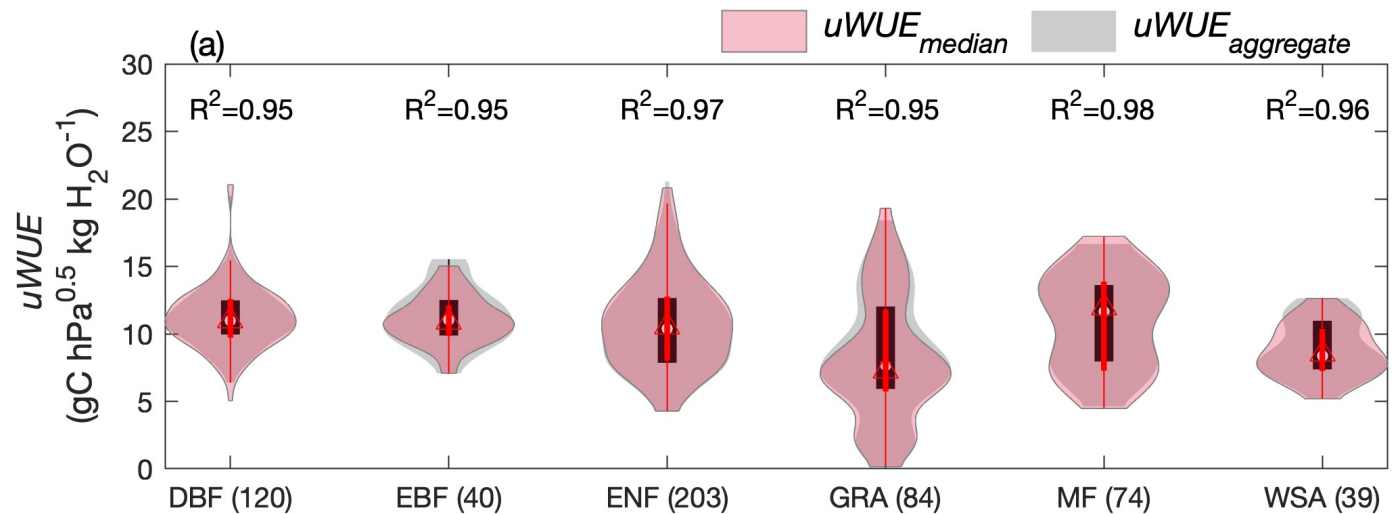
$$uWUE_{median} = median(uWUE_{hour})$$

$$uWUE_{aggregate} = \frac{\Sigma GPP_{hour}}{\Sigma ET_{hour}} * mean(\sqrt{VPD_{hour}})$$

$uWUE$ sensitivity to temporal resolution

Underlying water-use efficiency

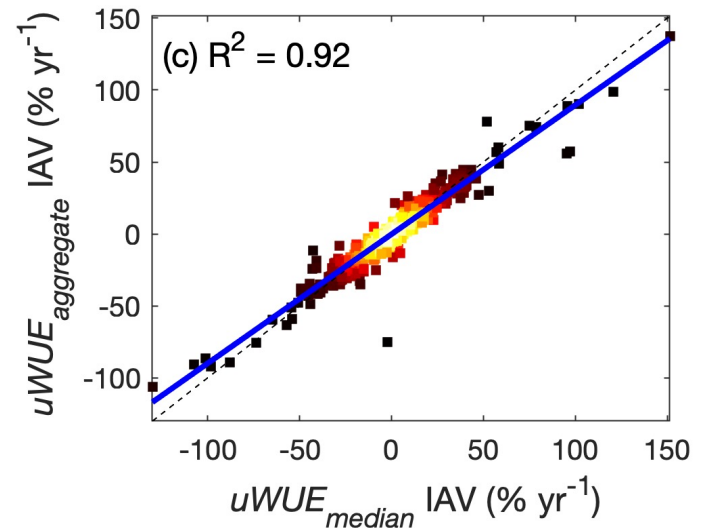
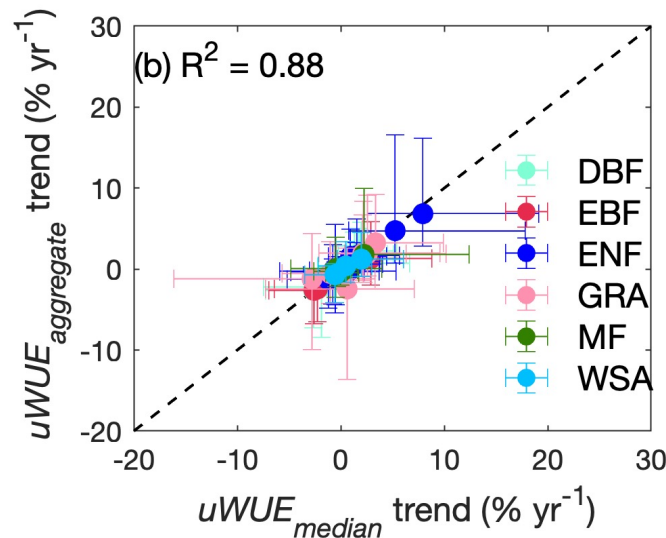
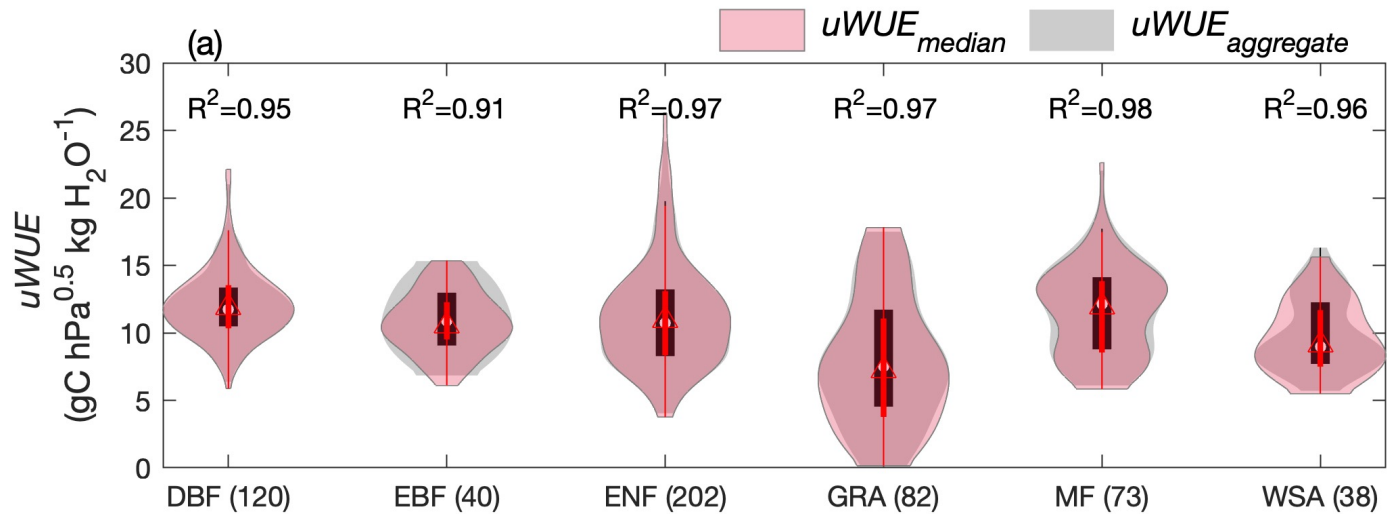
$$uWUE = \frac{GPP}{ET} * \sqrt{VPD}$$



Consistent results with summer only measurements

Underlying water-use efficiency

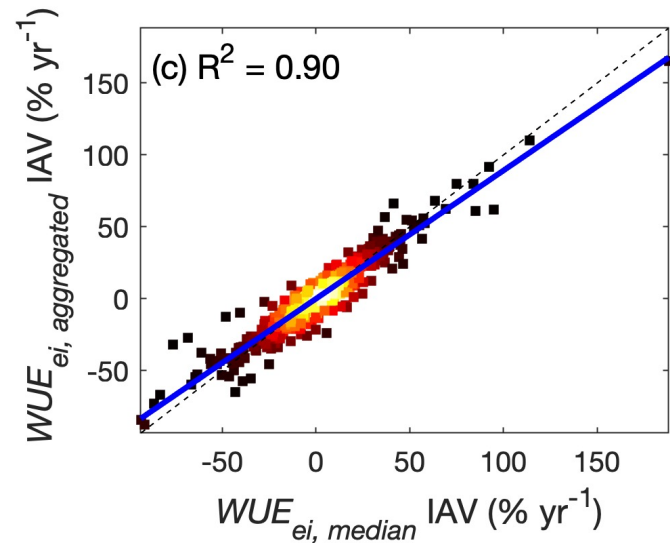
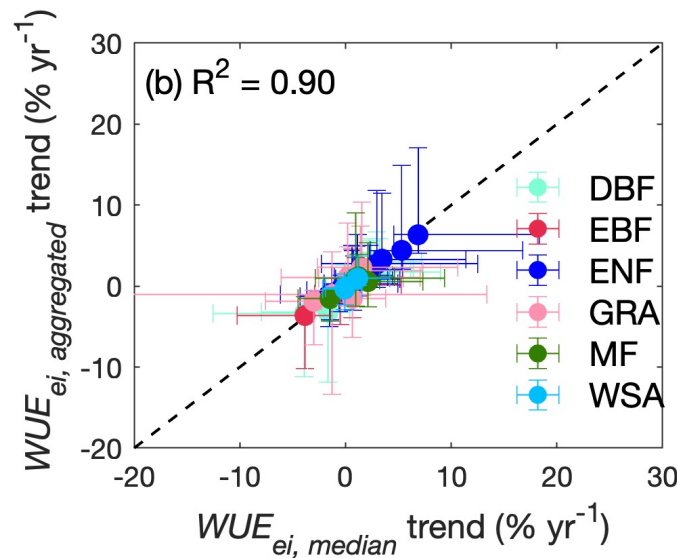
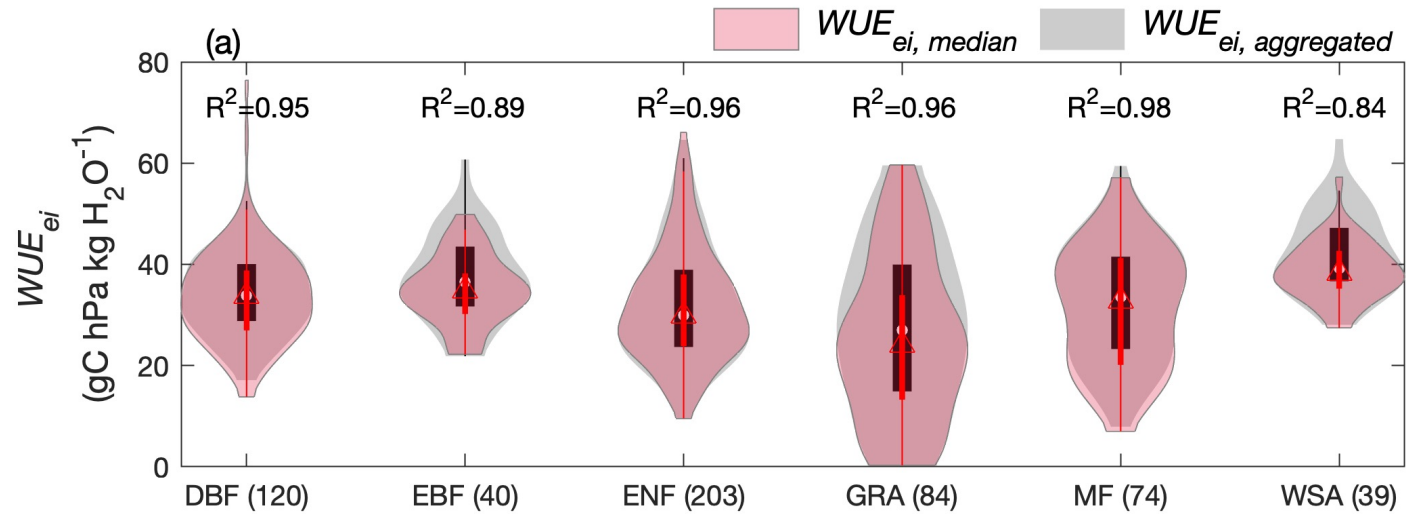
$$uWUE = \frac{GPP}{ET} * \sqrt{VPD}$$



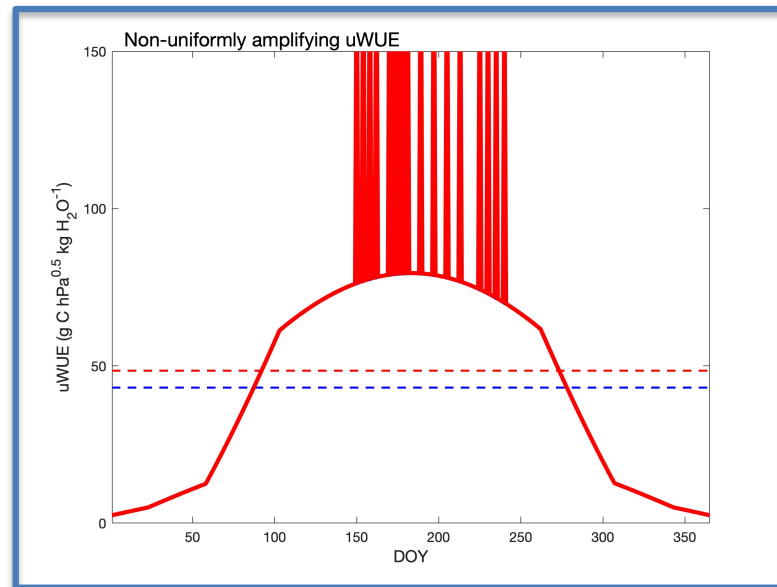
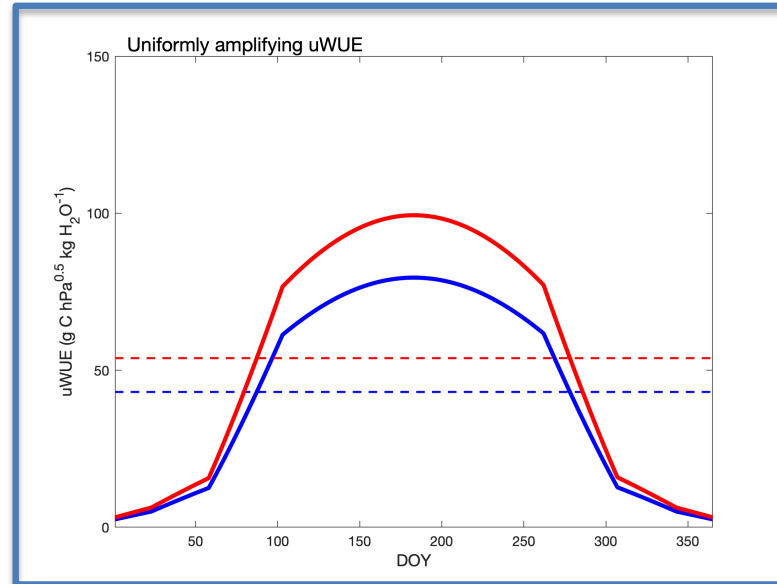
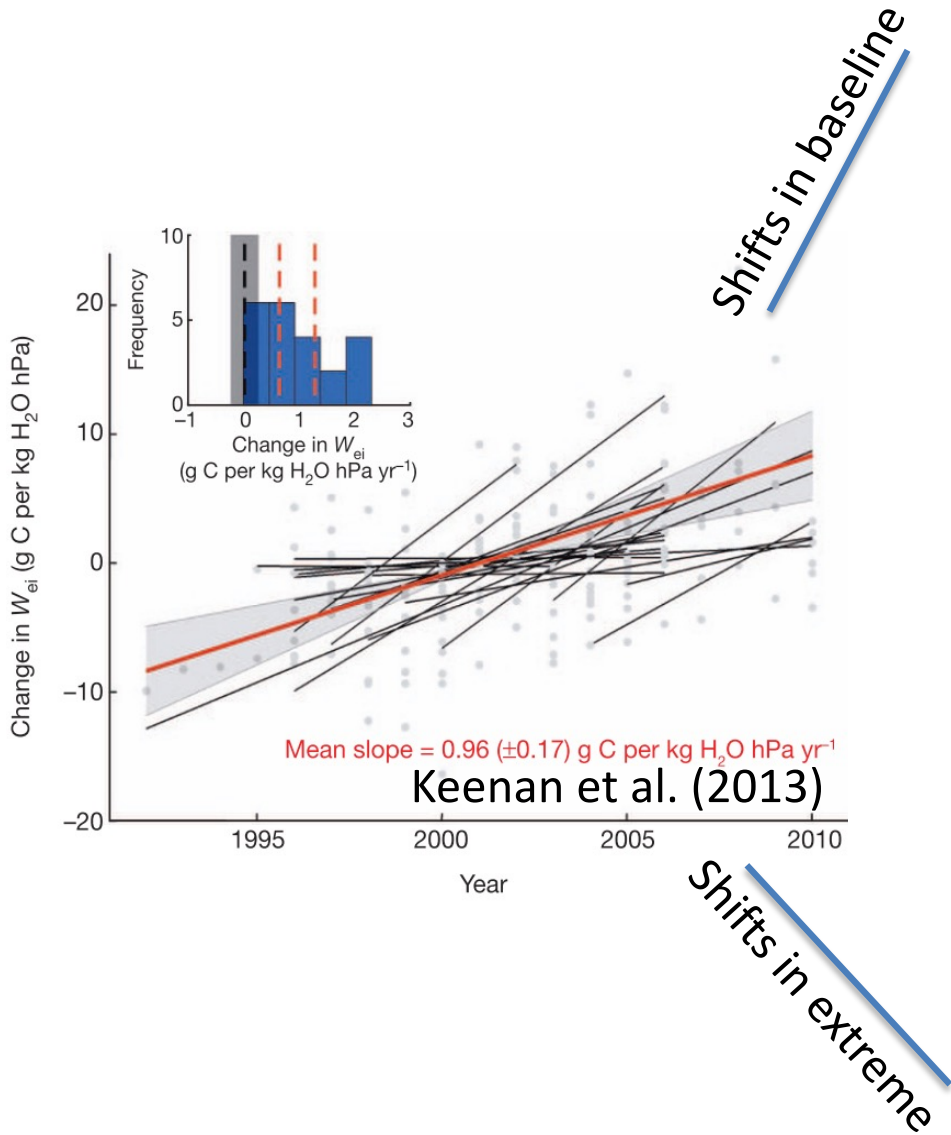
Consistent results with WUE_{ei}

Inherent water-use efficiency

$$WUE_{ei} = \frac{GPP}{ET} * VPD$$



What leads to recent increases in uWUE?

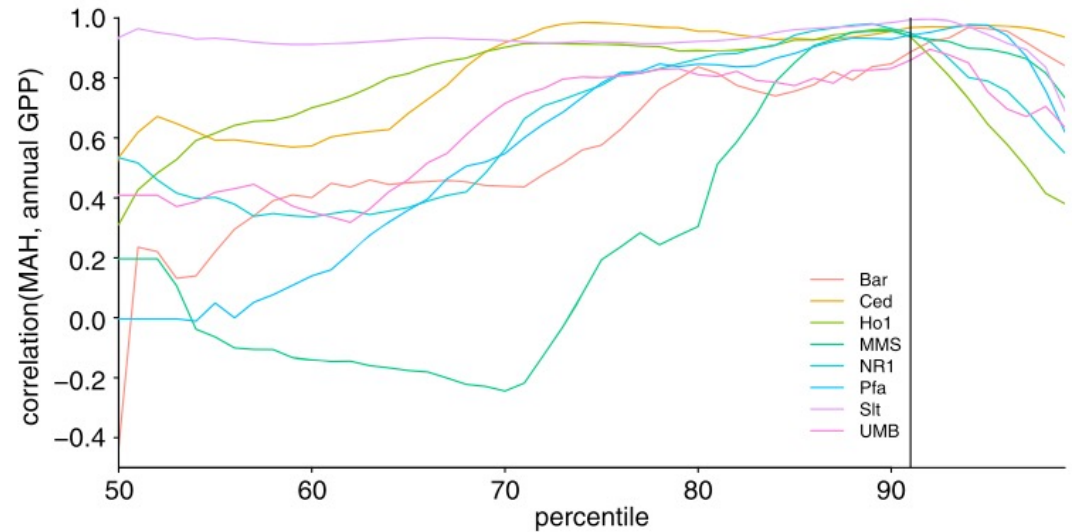


Most Active Hours (MAH)

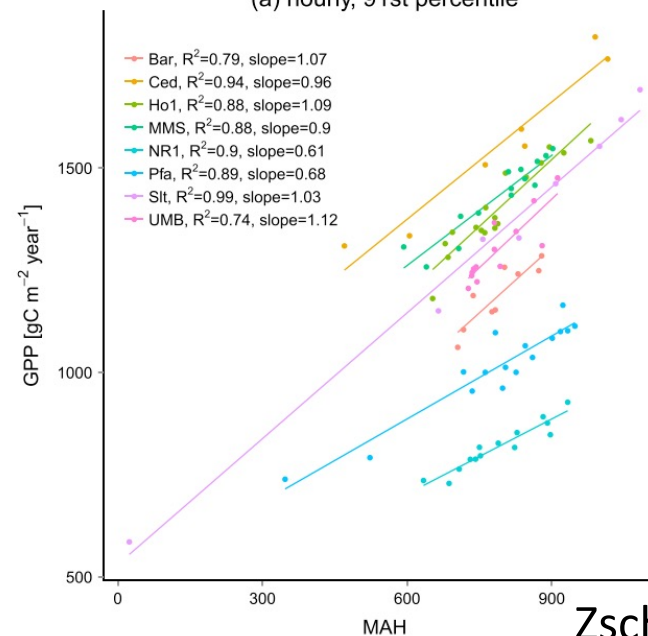
GPP, RE, NEP, and ET

$$MAH^x(y) = \sum_{i=1}^n 1_{\{x(y,i) > p\}}$$

The percentile of the respective flux over the entire site-years

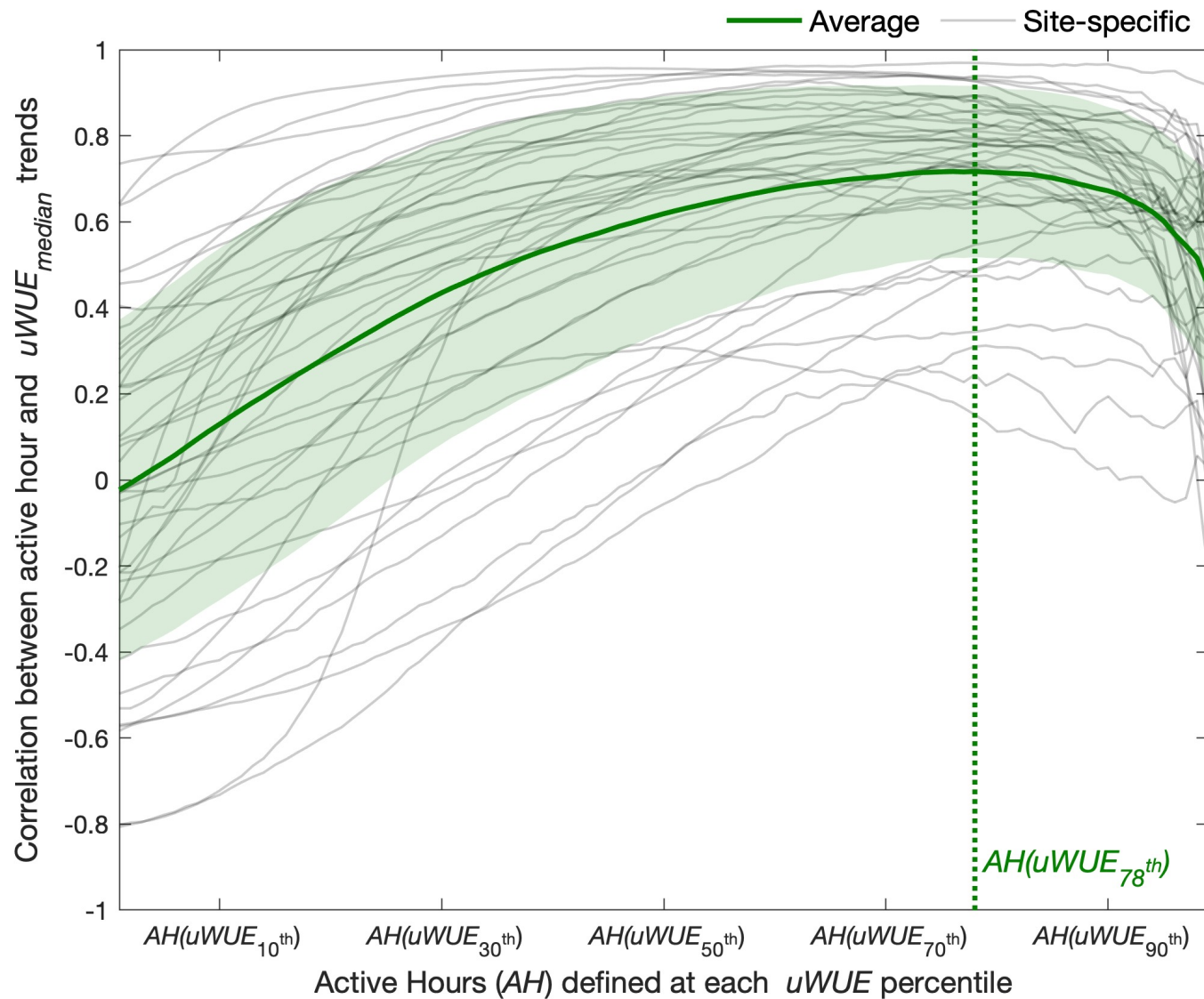


(a) hourly, 91st percentile

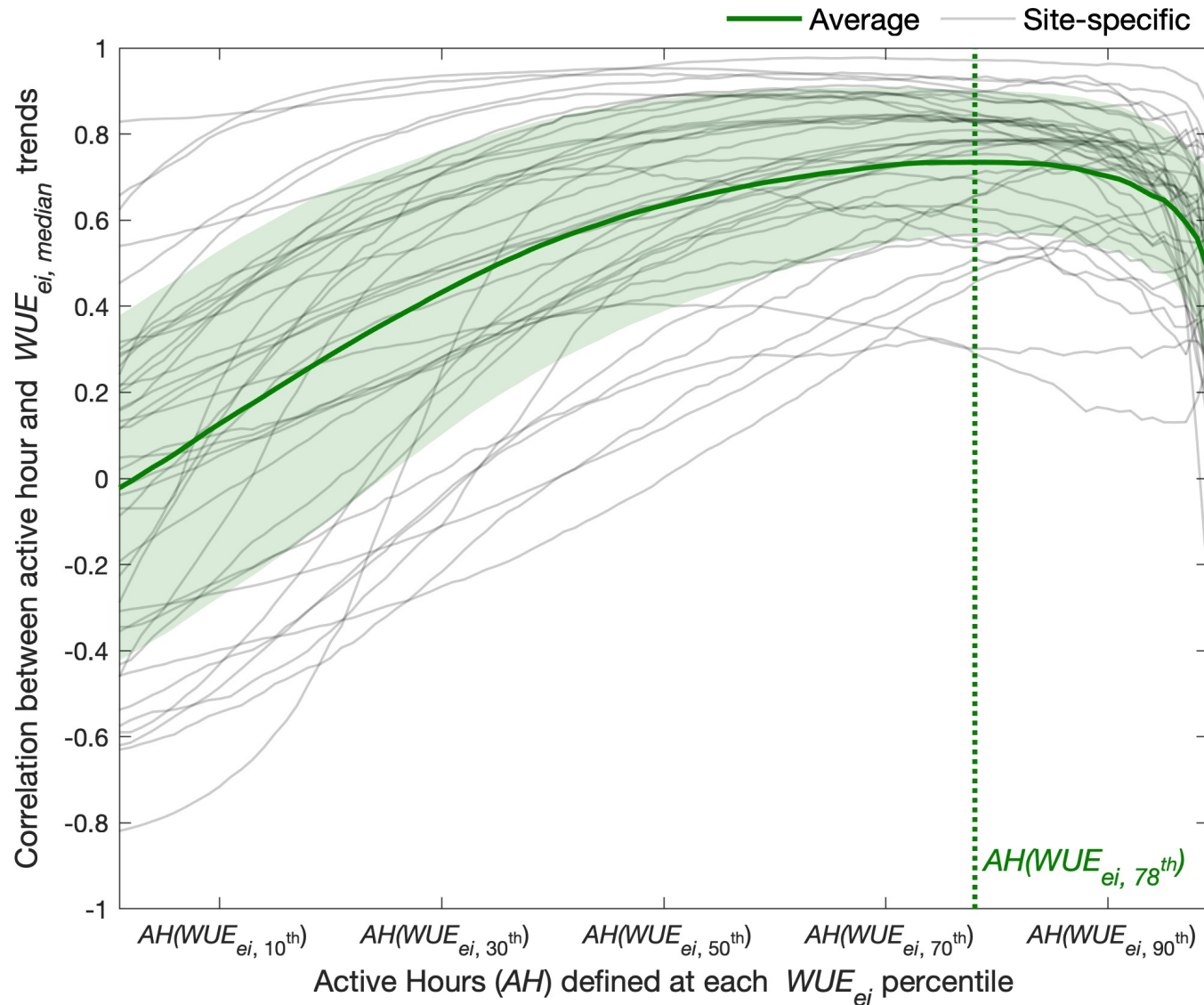


Zscheischler et al. (2016)

Correlation between AH and $uWUE$ increases with higher $uWUE$ percentiles



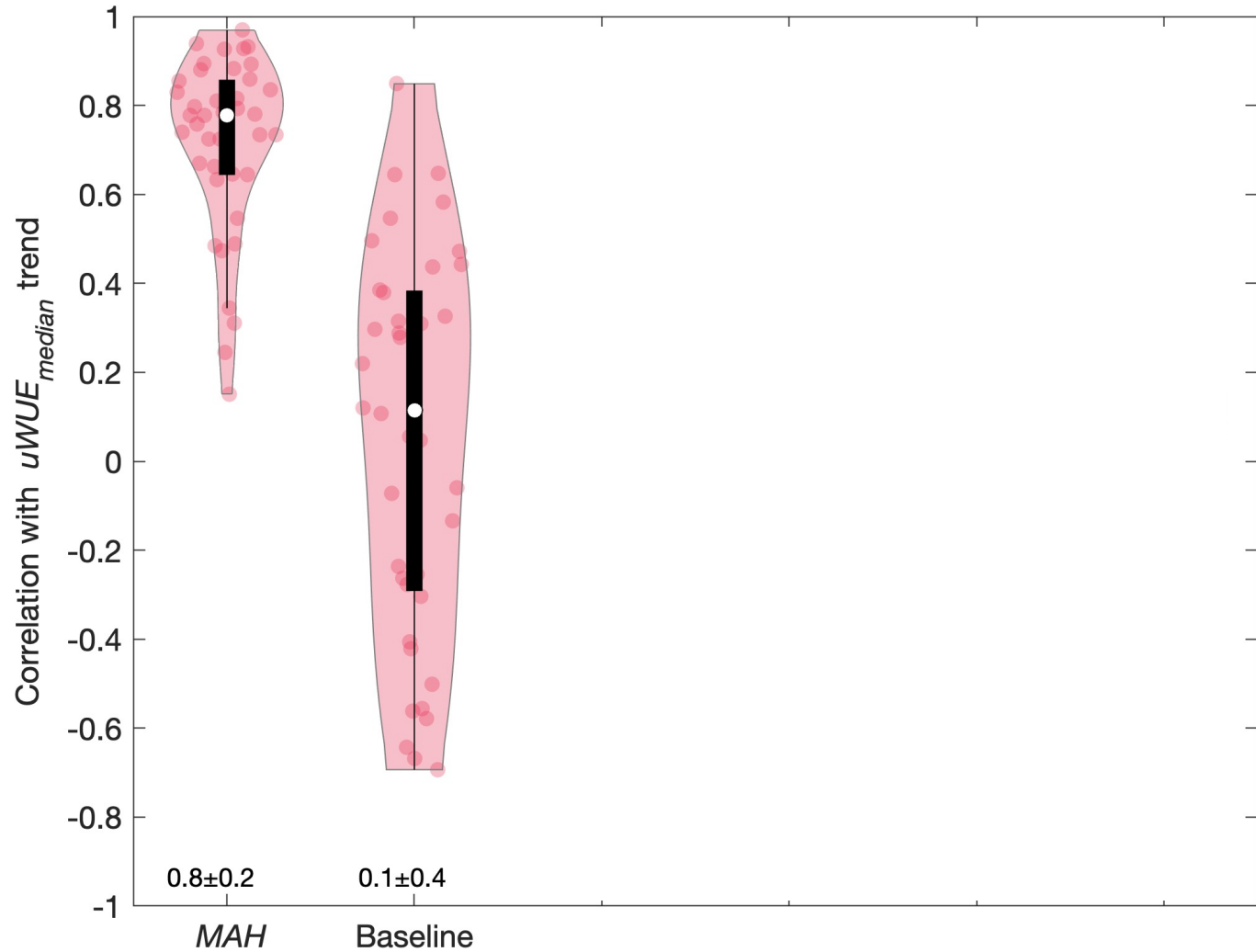
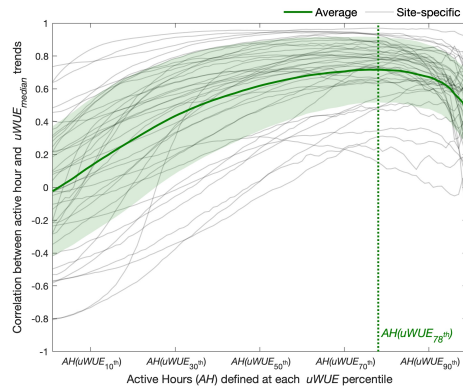
Consistent results with WUE_{ei}



Factors controlling decadal trends in $uWUE$

MAH -> $WUE \geq WUE^{78th}$

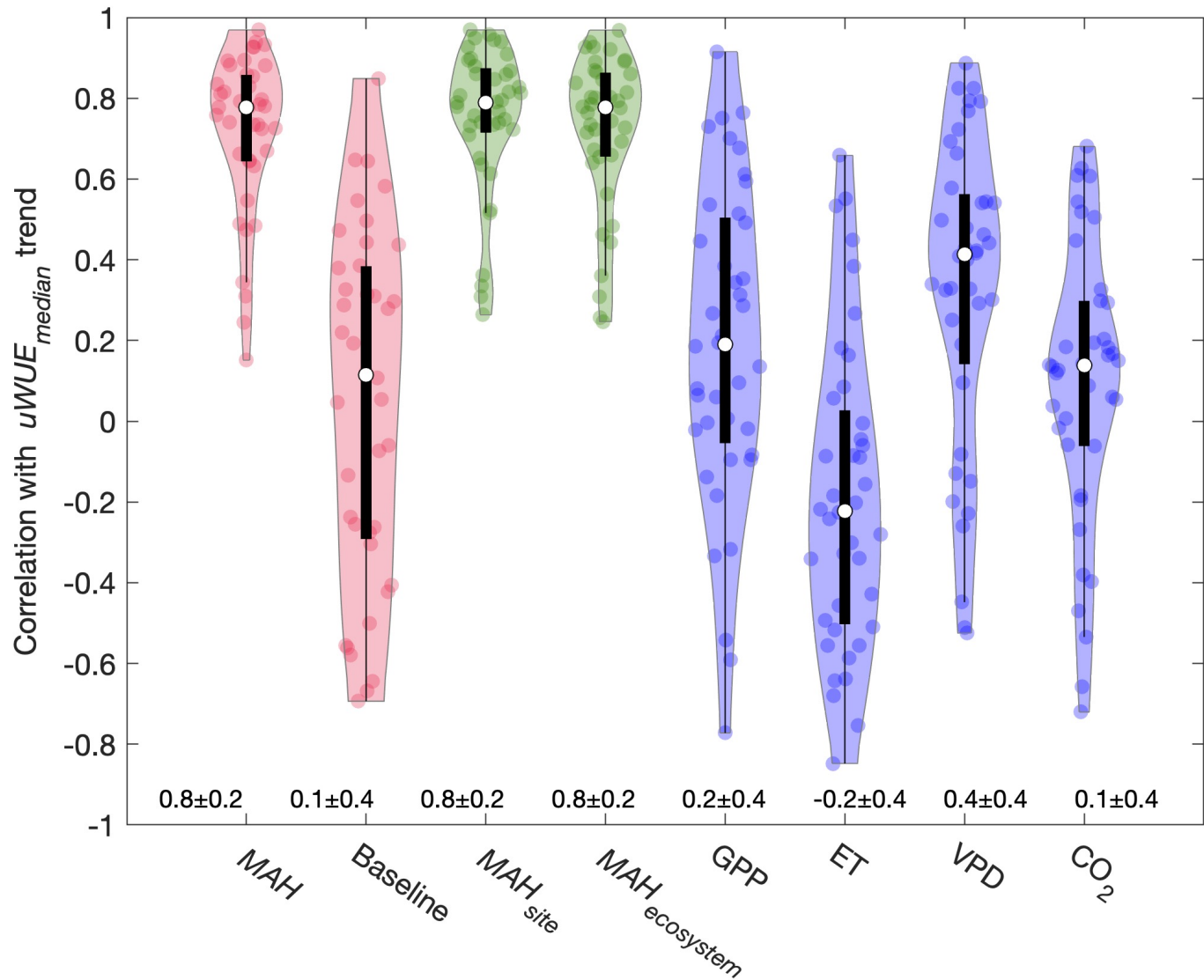
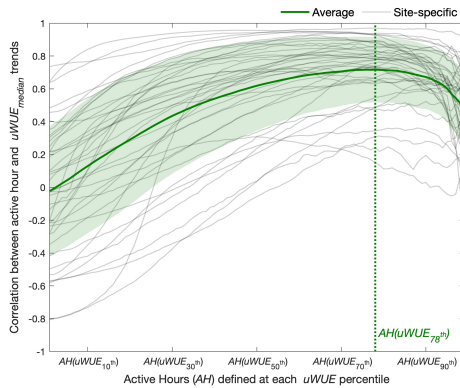
Baseline -> $WUE^{60th} \geq WUE \geq WUE^{40th}$



Factors controlling decadal trends in $uWUE$

MAH -> $WUE \geq WUE^{78th}$

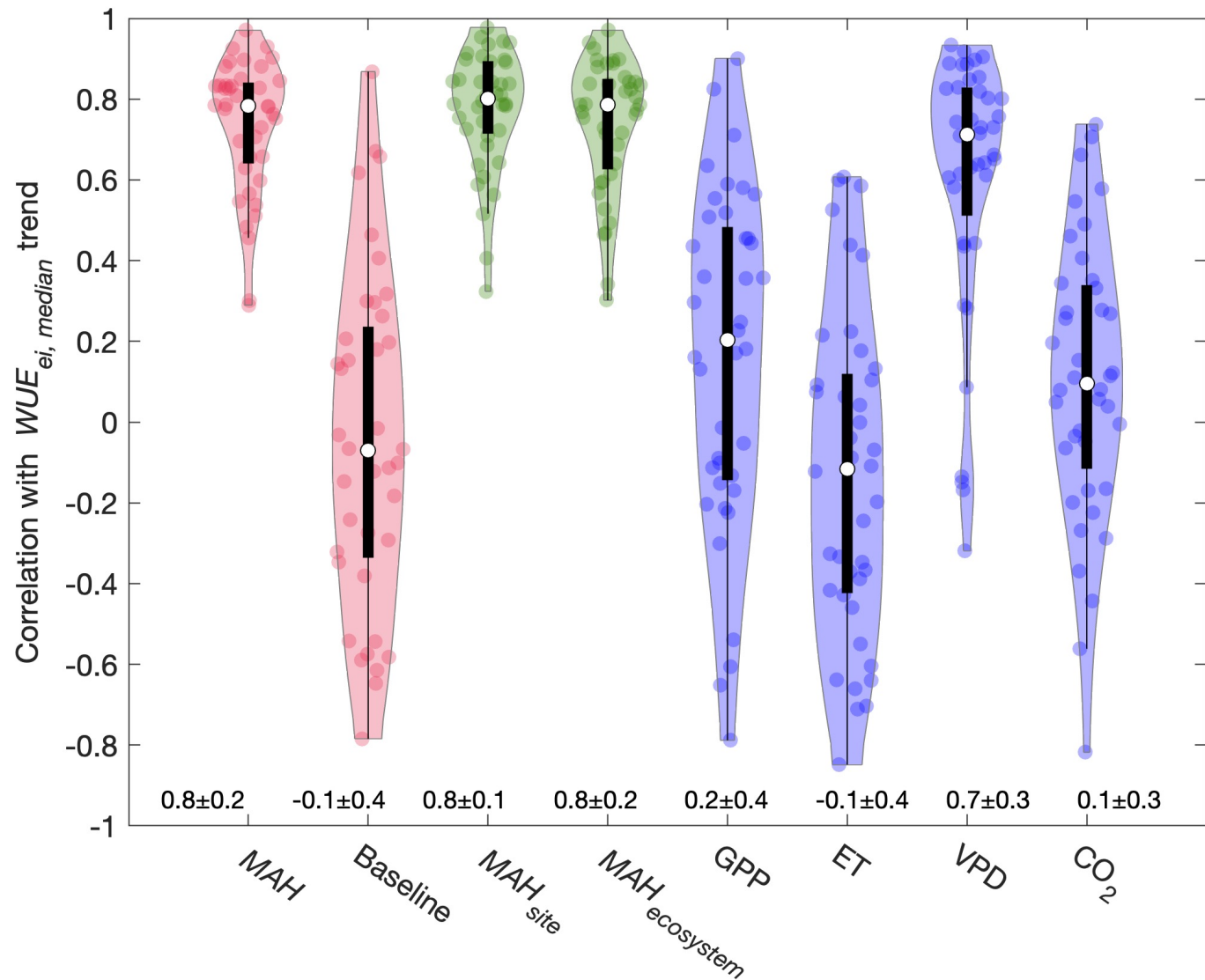
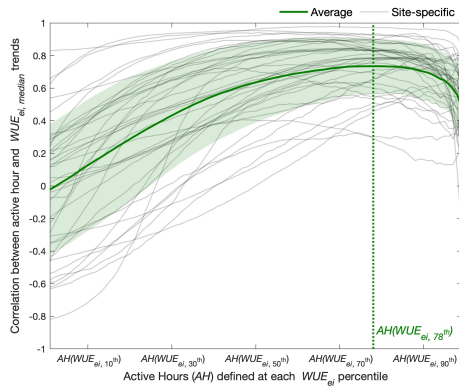
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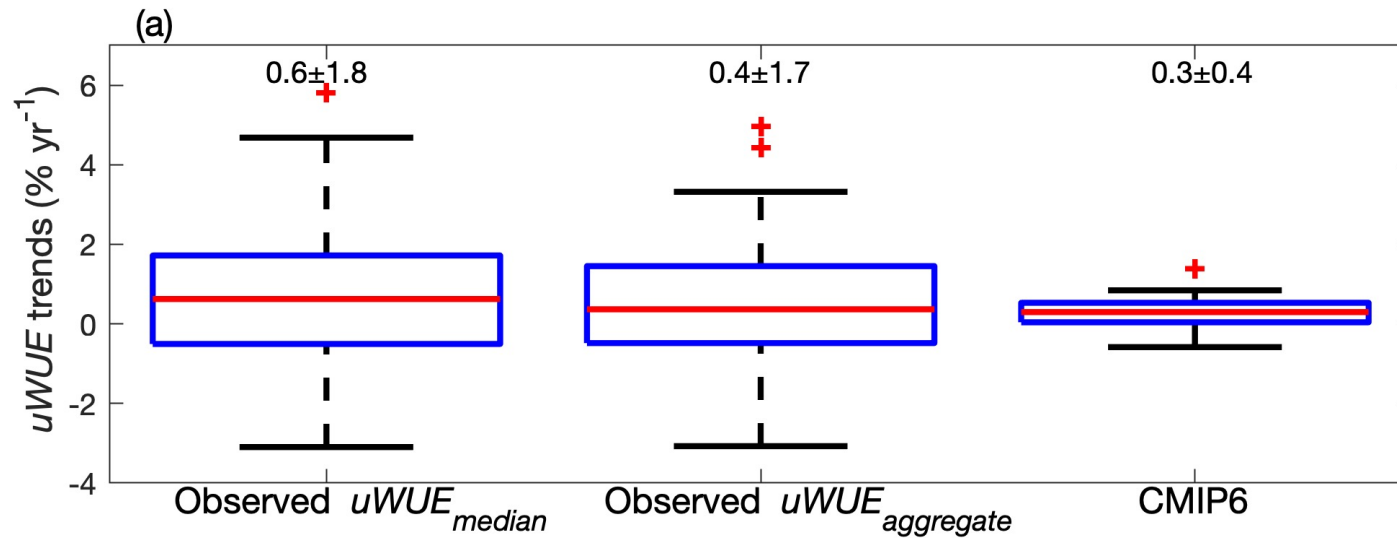
Consistent results with WUE_{ei}

MAH -> $WUE \geq WUE^{78th}$

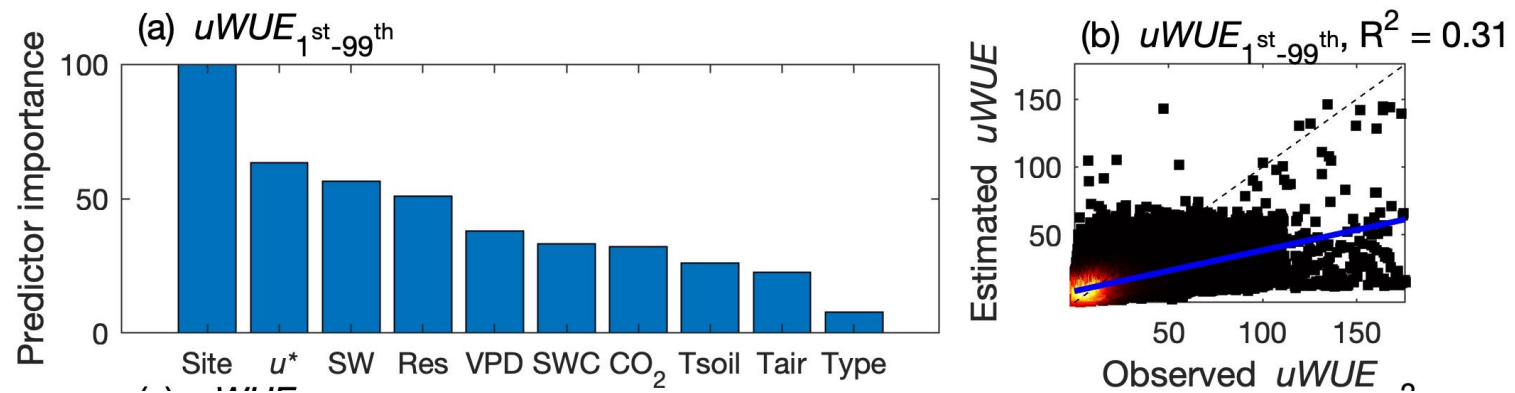
Baseline -> $WUE^{60th} \geq WUE \geq WUE^{40th}$



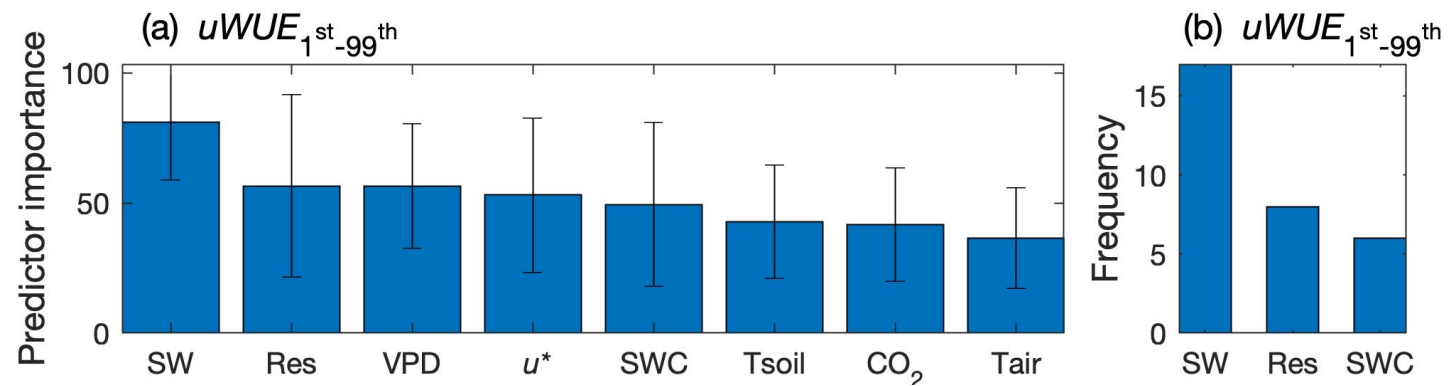
Favorable weather conditions modulate $uWUE$ trends



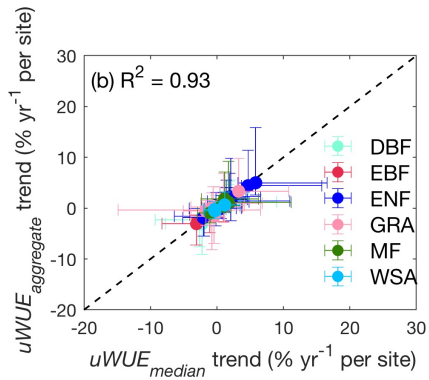
Large inter-site variability in WUE



Variations in solar radiation affect water-carbon interactions

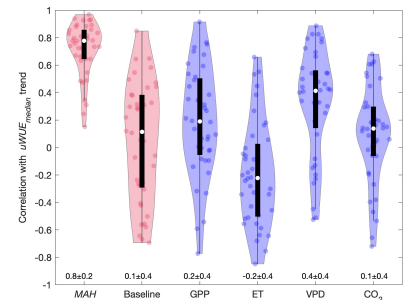


Summary

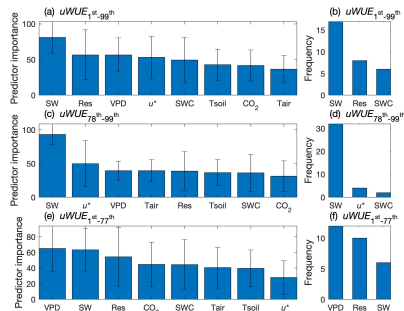
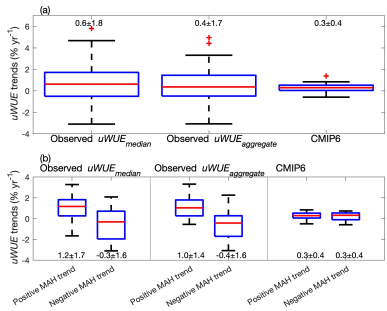


WUE trends inferred from the median of hourly *WUE* values are comparable with those from seasonal aggregated GPP, ET and VPD.

WUE trends correlate well with temporal changes in the number of hours when *WUE* is greater than its 78th percentile value.



MAH trends may amplify or dampen the corresponding *uWUE* trends. CMIP6 models do not resolve the sensitivity observed in ecosystem-scale flux measurements.

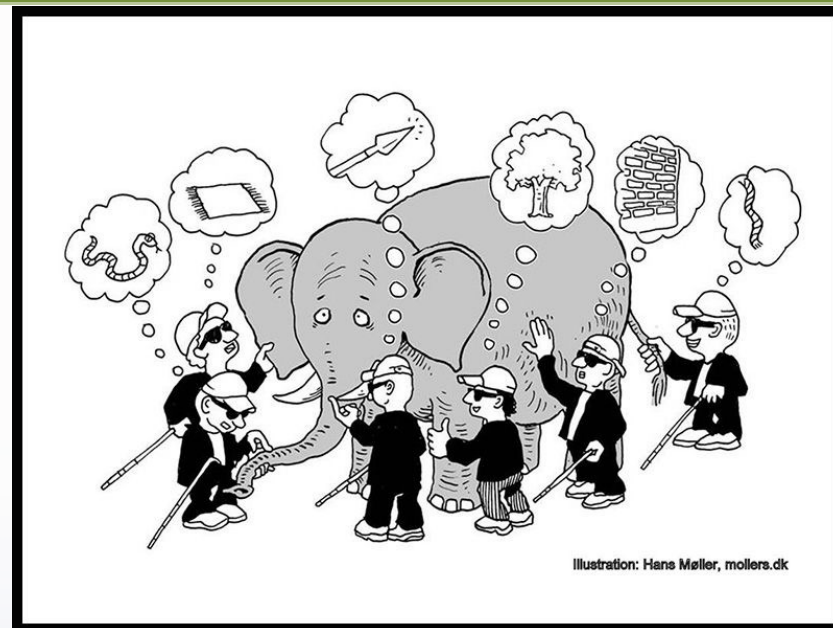


Enhanced feedbacks to solar radiation elevates ecosystem-scale *WUE*, which contributes to high correlation between *WUE* and *MAH*.



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Questions?



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