



Estimating crop evapotranspiration of managed alpine grassland using remotely sensed LAI

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Assessing grassland water loss

Why do we need to know how much water a grassland is losing?

- Indicator of drought
- Hydrological models
- Growth models
- Biomass production
- ...

How to get the water loss of a grassland?

- Directly: e.g., **lysimeters**, eddy covariance
 - Problem: Cost/maintenance/point
- Indirectly: residual of energy balance, **ET models**
 - Problem: Assumptions/accuracy



AREC Raumberg-Gumpenstein

Penman-Monteith equation

Reference evapotranspiration ET_0 – (FAO-56)

- Input: radiation, temperature, humidity, wind
- Grass reference crop
- Crop height h_c of 0.12 m
- Fixed surface resistance r_s of 70 s m^{-1}

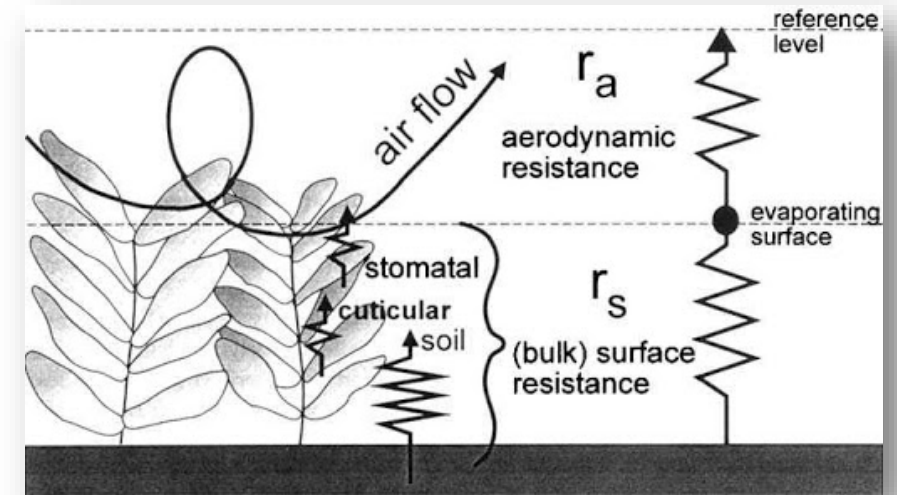
Crop evapotranspiration ET_c

- Crop coefficient Kc
- Measurements of LAI and crop height h_{crop}
- Aerodynamic resistance r_a and surface resistance r_s

$$r_s = \frac{r_l}{LAI_{act}}$$

$$r_a = \frac{\ln \left[\frac{z_m - 2/3 h_c}{0.123 h_c} \right] \ln \left[\frac{z_h - 2/3 h_c}{0.1(0.123 h_c)} \right]}{k^2 u_z}$$

$$ET_c = \frac{\Delta(R_n - G) + \rho_a c_p (e_s - e_a)/r_a}{\lambda \left[\Delta + \gamma \left(1 + \frac{r_s}{r_a} \right) \right]}$$



FAO-56 – Crop evapotranspiration (Allen et al. 1998)

Motivation

Compare estimated ET_c using:

1. Indirect in-situ LAI measurements (AccuPAR LP-80)
2. LAI from the proximal remote sensing approach (Field spectrometer)
 - Same LAI Retrieval Algorithm as for Sentinel-2 data

Can we estimate ET_c without in-situ measurements?

- Leaf Area Index ✓
- Crop height?
- Compare with FAO-56 reference ET

Study area: HBLFA Raumberg-Gumpenstein

Lysi-T-FACE experiment (Herndl et al., 2011) – Ambient CO₂ lysimeter

- High precision weighable lysimeter
- Soil water fluxes (ET, Precipitation, Seepage) (**Forstner et al. 2020**)
- Crop height collected using ultrasonic sensors
- 3-cut system
- Data availability: vegetation period 2016-2019



Data collection of Leaf Area Index (LAI) (Klingler et al., 2020)

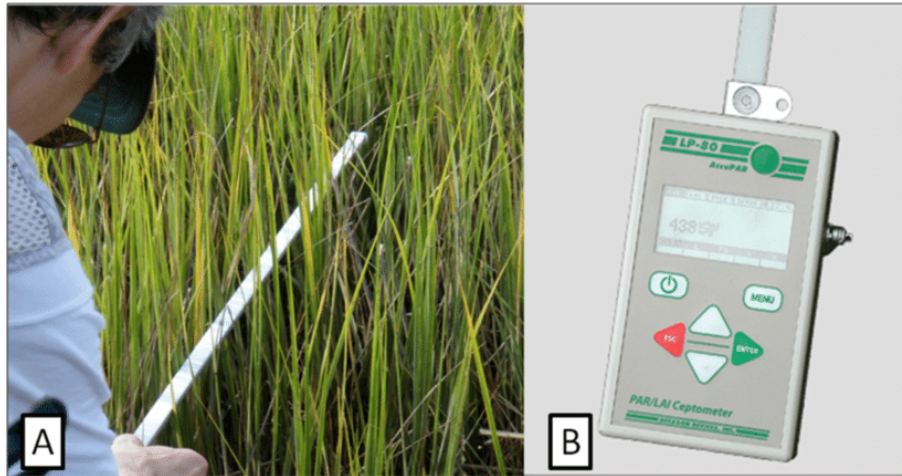
Indirect in-situ measurements

- AccuPAR LP-80 Ceptometer (Decagon Devices)

Proximal remote sensing approach

- Field spectrometer HandySpec Field VIS/NIR 1.7 (tec5 AG)
- Same LAI Retrieval Algorithm as for Sentinel-2 data

AccuPAR LP-80

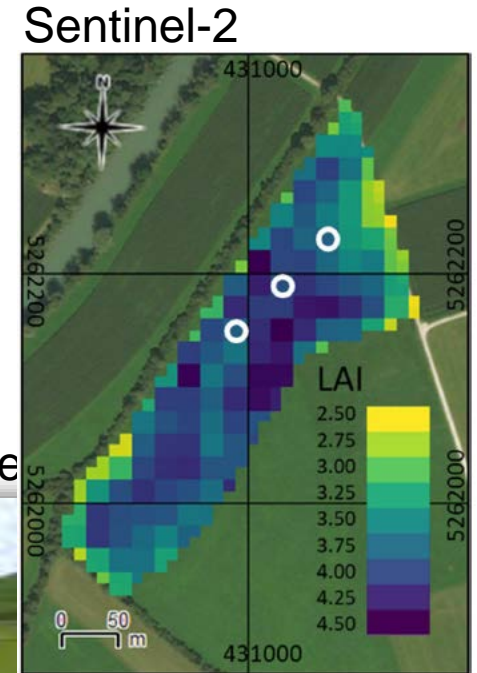


Bachmann et al. (2012)

Field spectrometer HandySpec



Schaumberger et al. (2020)



Klingler et al. (2020)

Comparing crop ET (ET_c) with lysimeter ET (ET_a)

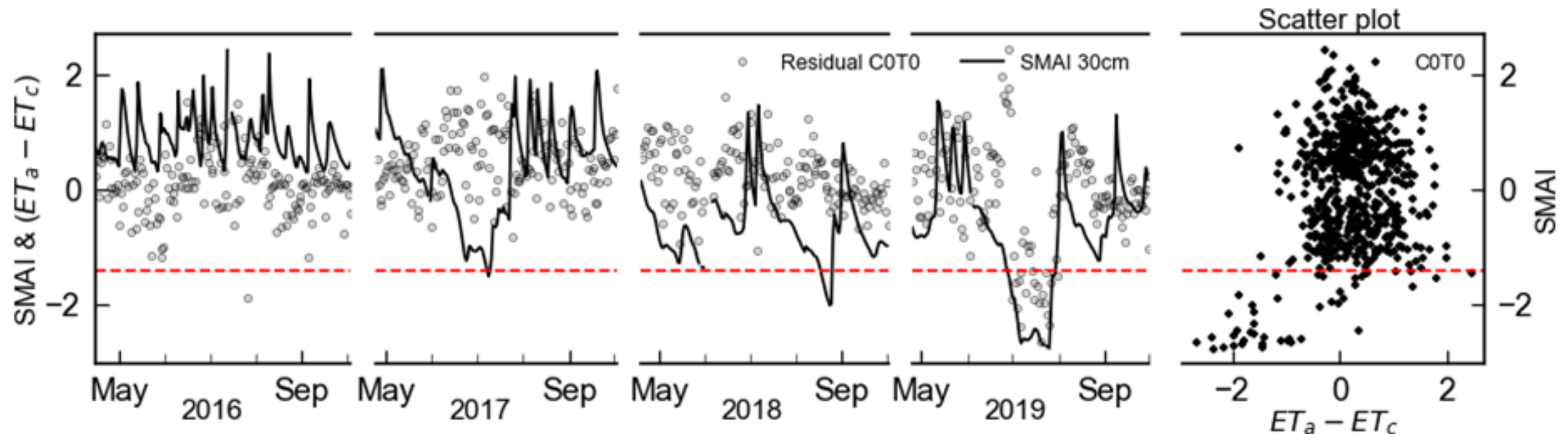
Water stress:

1. $ET_a - ET_c \approx 0$; no water stress
 $ET_a - ET_c \ll 0$; water stress
2. $SMAI < -1.42$ severe drought event (Mckee, 1993)

Soil moisture anomaly index (SMAI):

$$SMAI = \frac{\theta - \bar{\theta}}{\sigma_{\theta}}$$

θ - soil water content at 30 cm,
 $\bar{\theta}$ - long-term average soil water content,
 σ_{θ} - standard deviation.

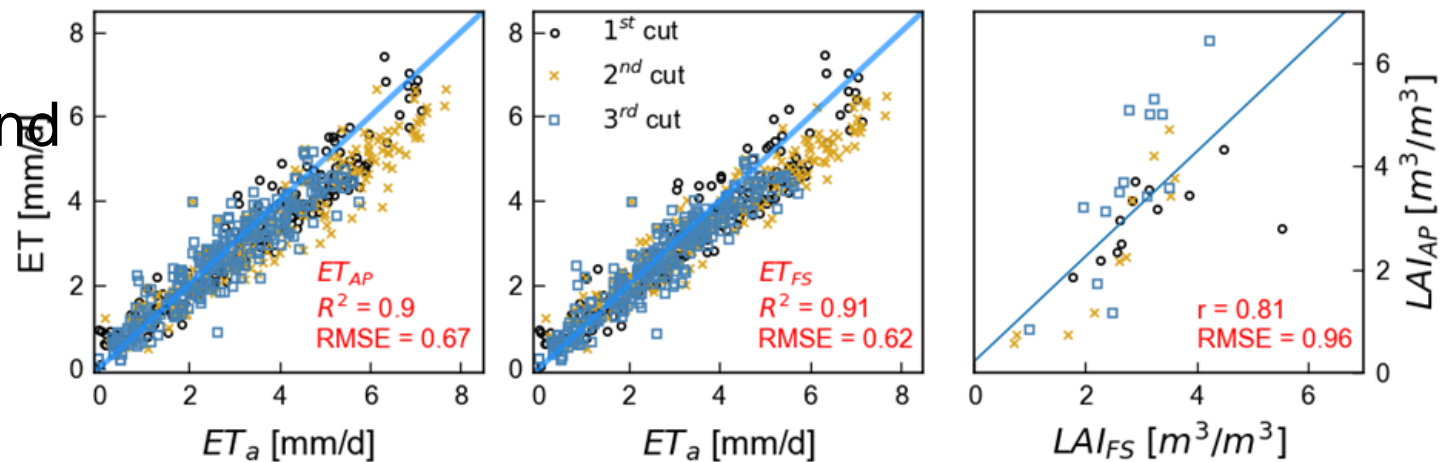
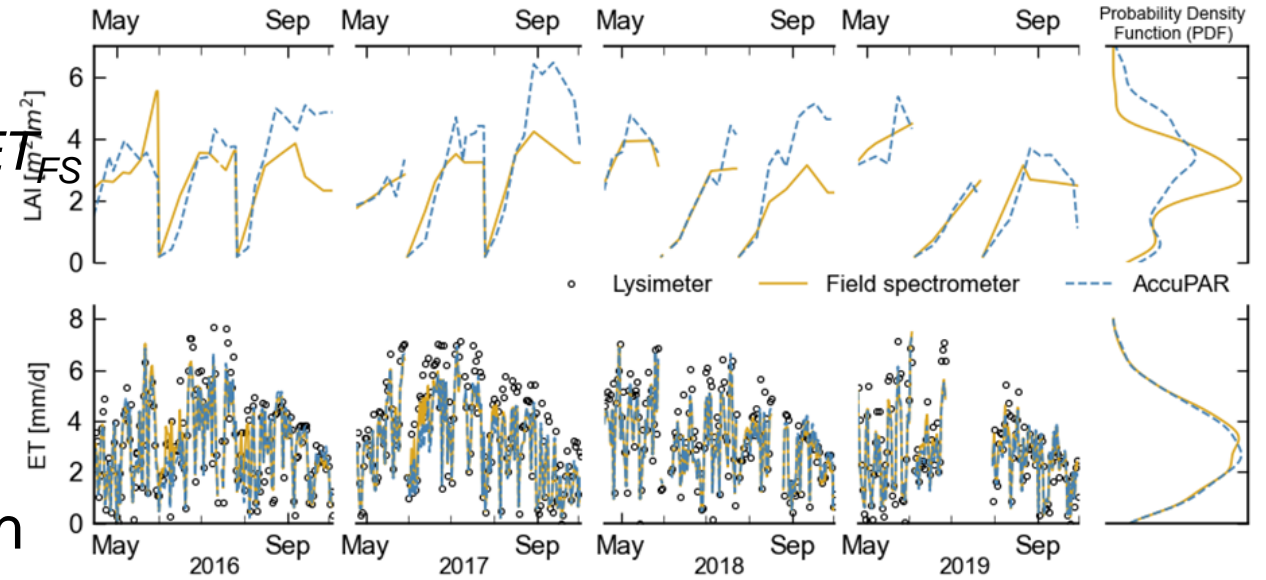


ET_c estimated with ACCUPAR vs Field spectrometer

ET_c estimated using AccuPAR (LAI_{AP}) = ET_{AP}

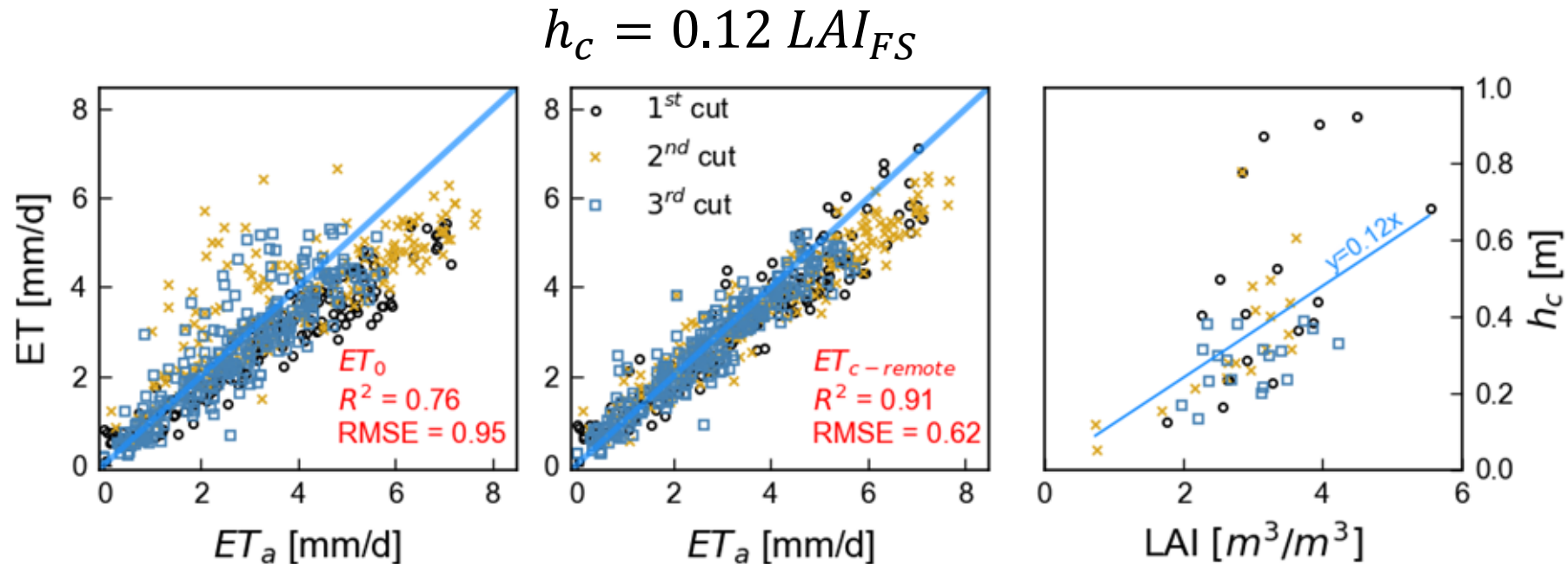
ET_c estimated using Field spectrometer (LAI_{FS}) = ET_{FS}

- High correlation between LAI_{AP} and LAI_{FS} for the 1st and 2nd cut
- ET_{FS} showed overall better agreement with lysimeter ET as ET_{AP}
- Overestimation of LAI_{AP} in the second and third cut seems to affect the estimation of ET_c negatively



Estimation of ET_c using an LAI/ h_c relationship

A relationship between LAI and h_c was obtained by fitting a simple linear function $y = k*x$ to the ultrasonic crop height data from the lysimeter plot.



- $ET_{c-remote}$ estimated using LAI_{FS} and h_c from the above relationship outperforms the standard reference Evapotranspiration ET_0

Conclusions

- **High agreement** between ET_{AP} and ET_{FS} with ET_a
 - Small deviations of ET_{AP} with ET_a in the 2nd and 3rd cut (overestimation of LAI_{AP})
- High agreement between $ET_{c-remote}$ and ET_a
 - $ET_{c-remote}$ **outperforming** ET_0

	1 st cut	2 nd cut	3 rd cut	Whole period
LAI_{FS}	3.32	2.19	2.50	2.60
LAI_{AP}	3.32	2.22	3.39	2.99
RMSE ET_{FS}	0.62	0.78	0.50	0.62
RMSE ET_{AP}	0.59	0.87	0.54	0.67
RMSE $ET_{c-remote}$	0.68	0.78	0.46	0.62
RMSE ET_0	1.00	1.21	0.69	0.95

Table: Mean values of the interpolated Leaf Area Index and the root-mean-square errors (mm/day).

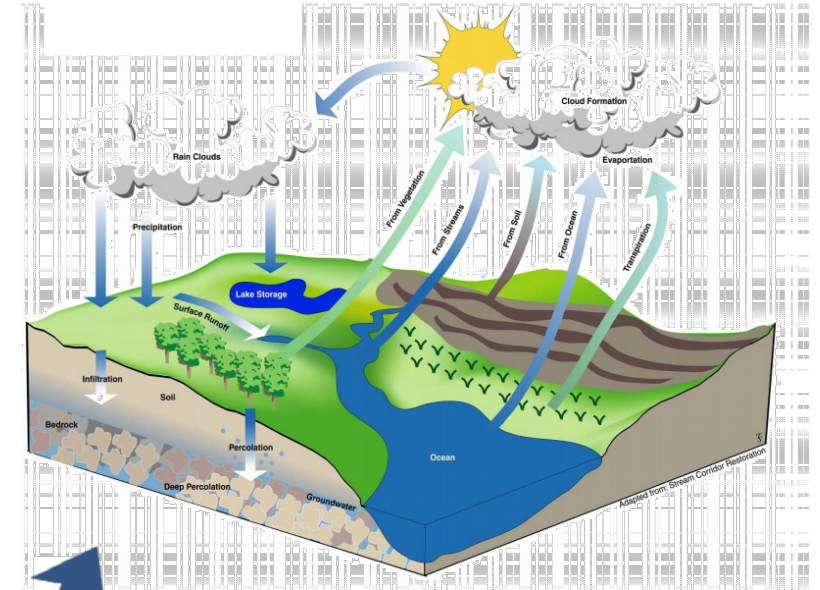
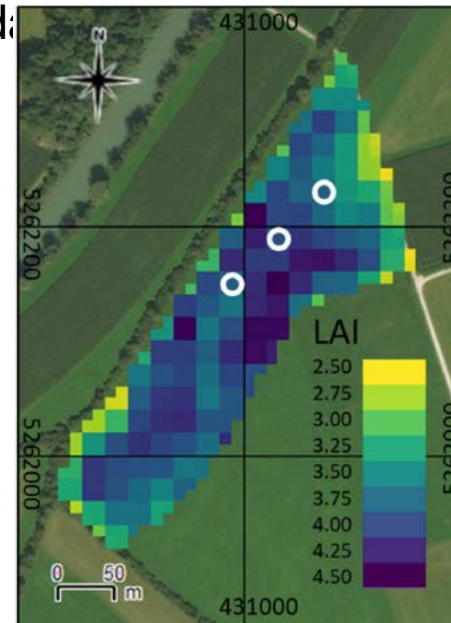
Outlook

- High correlation between Sentinel-2 and field spectrometer LAI (Klingler, 2020)
 - same LAI retrieval algorithm
 - **opportunity to expand these findings on a regional scale**

Field spectrometer HandySpec



Sentinel-2 LAI satellite data



Regional hydrological models
Regional biomass production



Thanks for your attention!

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