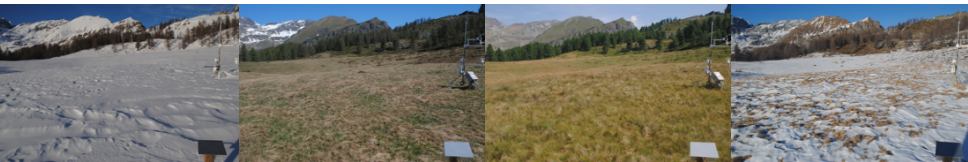

Heat wave beats green wave: the effect of a climate extreme on alpine grassland phenology as seen by phenocams

E. Cremonese¹, G. Filippa¹, M. Migliavacca², C. Siniscalco³, L. Oddi³, M. Galvagno¹

¹Environmental Protection Agency of Aosta Valley, Italy

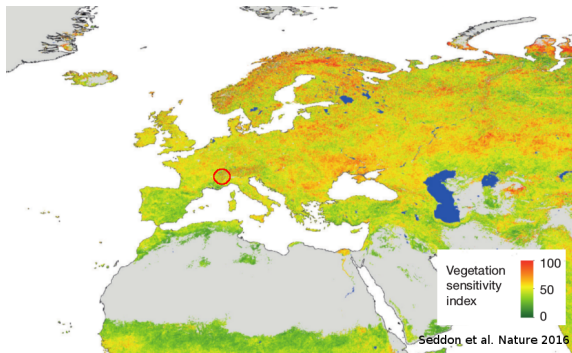
²Max Planck Institute for Biogeochemistry, Jena, Germany

³Dept. of Life Sciences and Systems Biology University of Torino, Italy



Climate extremes in the Alps

- ✓ Impact of 2015 heatwave on the phenology of an alpine grassland in the Northwestern Alps (Torgnon, 2100 m asl)
- ✓ "Alpine regions are **ecologically sensitive regions** with amplified responses to climate variability" (Seddon *et al*, 2016 Nature)



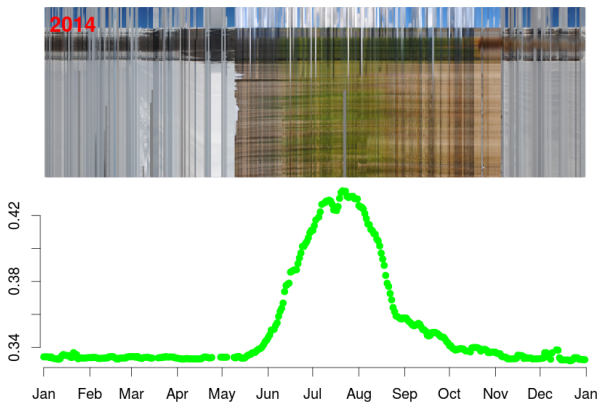
Climate extremes impact on phenology

- ✓ **green wave** or green-up is the spring onset of photosynthesis (Schwartz 1998 Nature)
- ✓ **green wave** as the greenness seasonal course seen by **phenocam**



Climate extremes impact on phenology

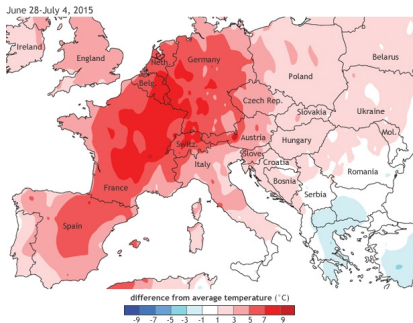
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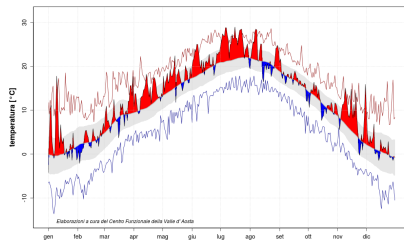
2015 heat wave

- ✓ 2015 breaks heat records (Nature 2016)
- ✓ July 2015 warmer and drier than July 2003

June July heat wave in Europe

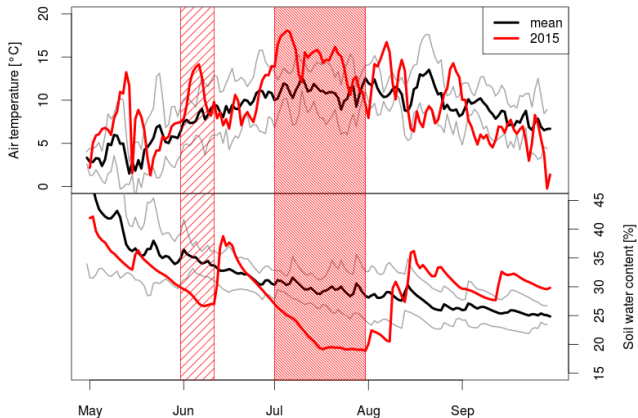


temperature anomaly in the Alps



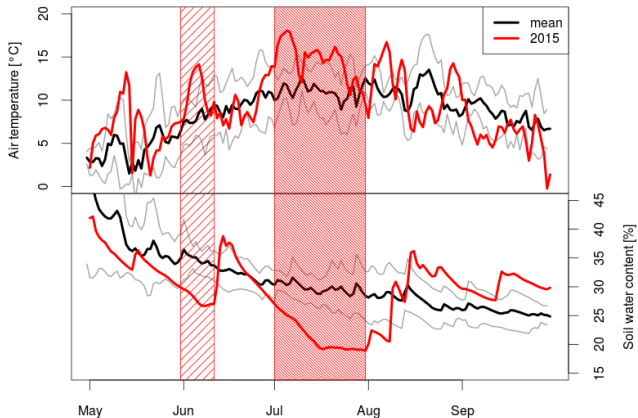
2015 heat wave

- ✓ June July heat wave at Torgnon grassland: co-occurrence of **high temperature** and **drought**
- ✓ "... when heatwaves coincided with drought, the plants showed clear signs of stress, resulting in vegetation browning and reduced phytomass production" (De Boeck *et al.* 2015)

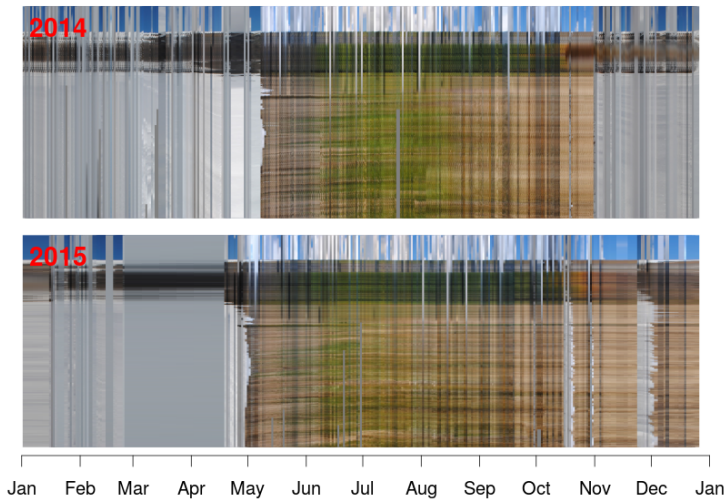


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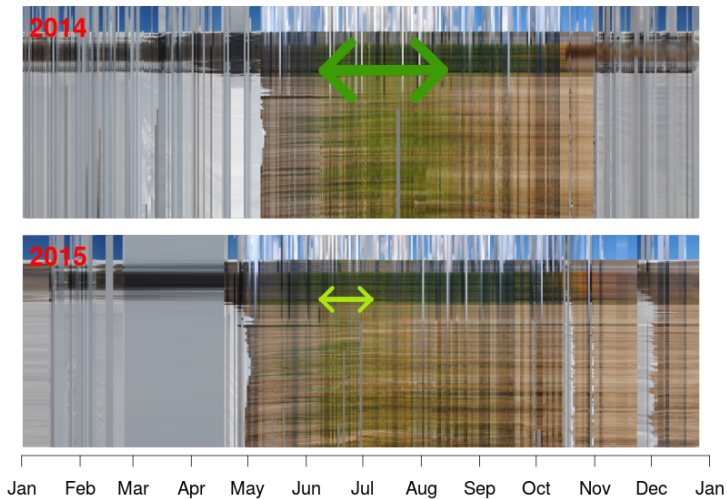
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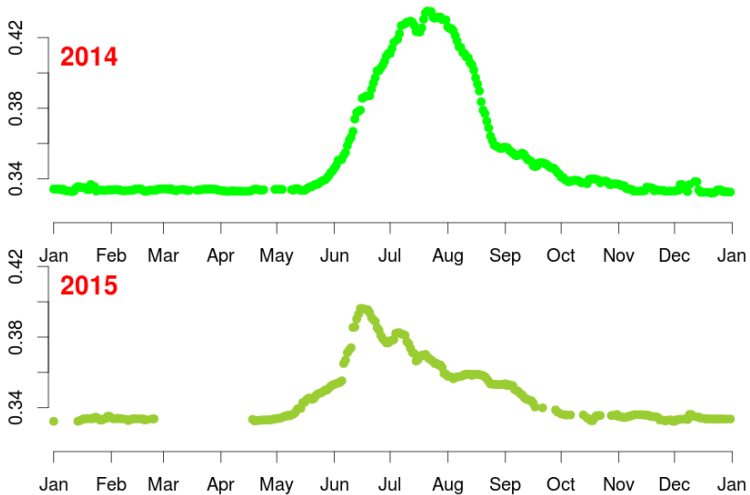
heat wave impact on green wave



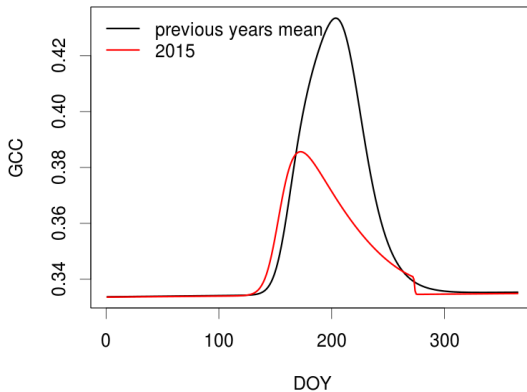
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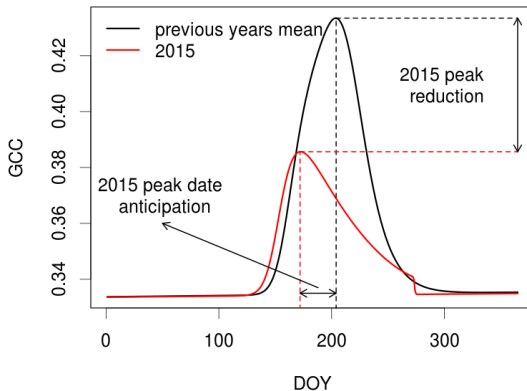


heat wave impact on green wave



- ✓ earlier start of senescence (i.e. peak anticipation)
- ✓ lower greenness (i.e. peak reduction)
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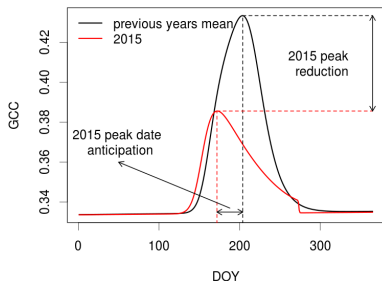
Objectives



- ✓ **Obj1:** GCC is able to detect the heatwave impact on functional or structural canopy properties
- ✓ **Obj2:** GCC decrease is driven by a combined effect of high temperature and drought

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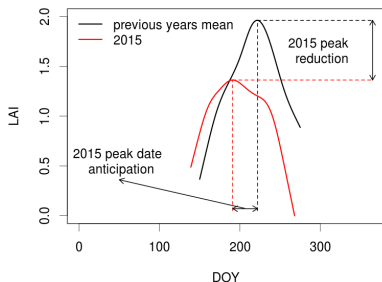
obj1: GCC is able to detect the heatwave impact on functional or structural canopy properties



- ✓ canopy photosynthesis (GPP, LUE, Amax), radiometric indexes (NDVI, PRI, Fapar), structural canopy properties (LAI, Biomass)
- ✓ **heatwave impact metrics** (e.g. peak reduction, anticipation) computed on all the variables

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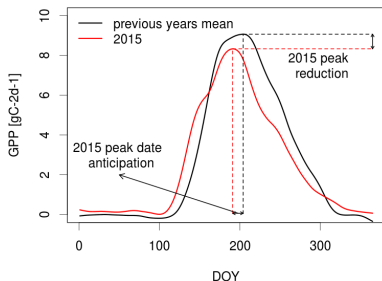
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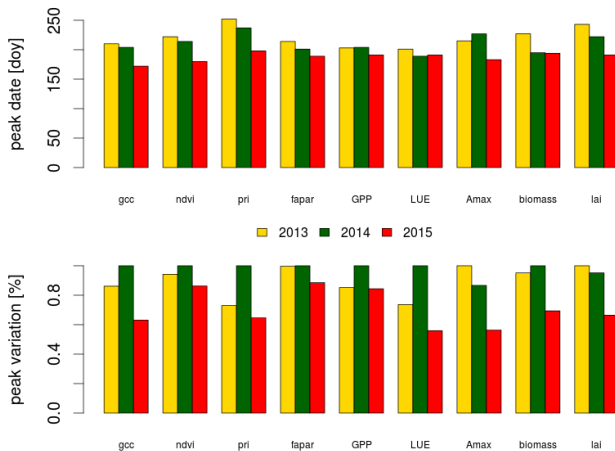
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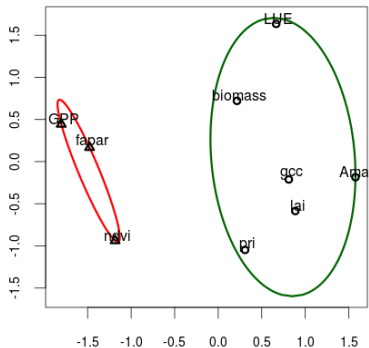
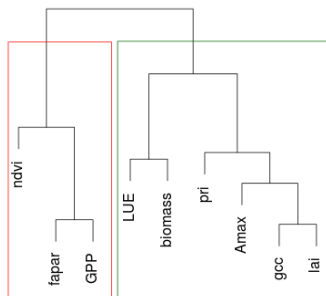


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heatwave impact metrics



variables grouping (hierarchical and pam clustering)



2015 summer heatwave impact

- ✓ Like GCC, all functional and structural variables showed an anticipation of peak dates (i.e. earlier senescence onset) and a reduction of peak values
- ✓ Cluster analysis reveals that heatwave impact on GCC is similar to the impact observed on LUE and Amax (parameters of **photosynthesis light response curve**), PRI (vegetation indexes related to **chlorophyll content**) and LAI and green biomass (**canopy structure**)



- ✓ GCC inter annual variability (IAV) can be used to track functional/structural canopy properties IAV

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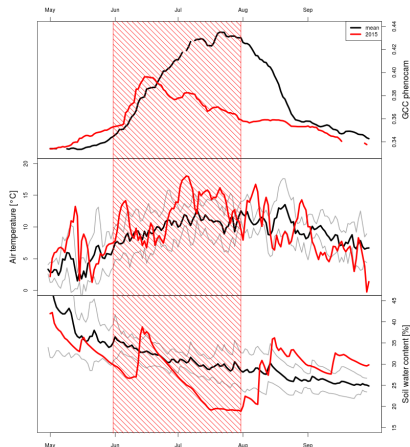
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Objectives

obj2: GCC decrease is driven by a combined effect of high temperature and drought



- ✓ **GSI model** (Jolly 2005 *et al.*, Stockli *et al.* 2011, Forkel *et al.* 2014)
- ✓ GSI is a bioclimatic index that predicts foliar phenology of vegetation driven by climate variables
- ✓ **GCC** modelling using **GSI** (Migliavacca *et al.* 2011)
 - snowmelt + temperature control on **spring**
 - photoperiod + temperature control on **senescence**

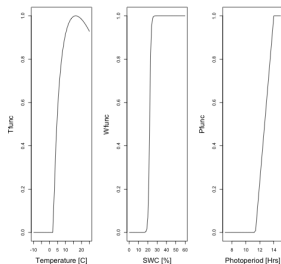
GSI model

new model formulation

- ✓ new optimum temperature limitation function (T_{opt})



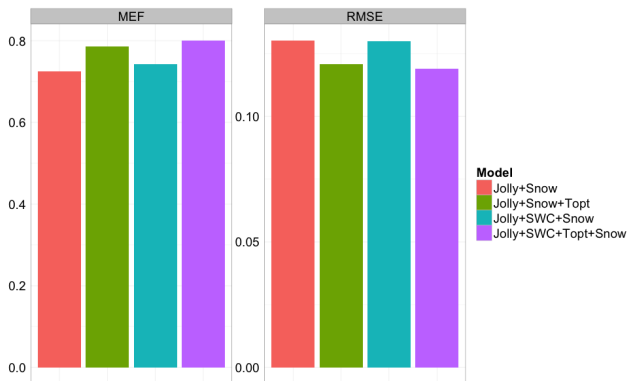
- ✓ canopy development is limited by hot temperatures



- ✓ 8 different GSI formulations including
 - temperature (T_{opt} and T_{step})
 - photoperiod
 - snow
 - VPD
 - SWC
- ✓ model parameters optimised for each model formulation (MCMC methods)

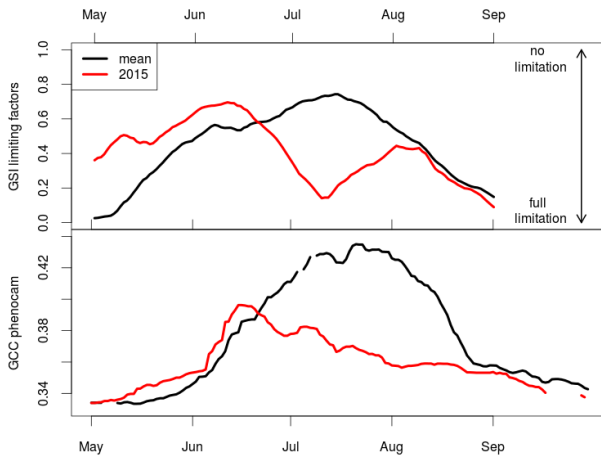
GSI model results

- ✓ GSI formulation including **high temperature** (T_{opt}) and **soil water content limitation** (SWC) gives the best results (MEF: 0.82, RMSE: 0.12)



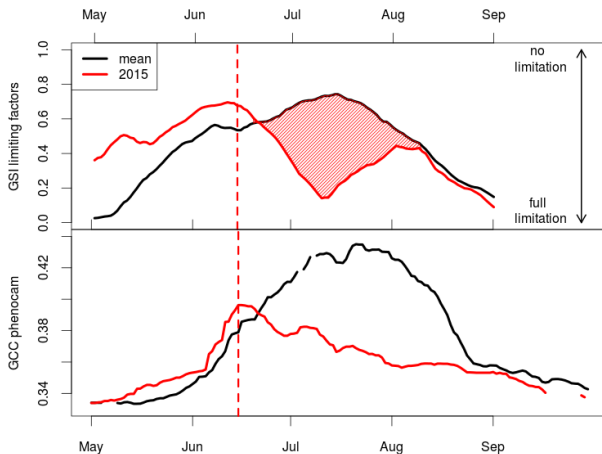
GSI model results

✓ high temperature and drought co-limitation



GSI model results

✓ high temperature and drought co-limitation



GSI model results

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- ✓ results highlight the combined effect of **high temperature and drought** on GCC decrease during the heatwave

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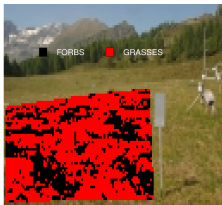
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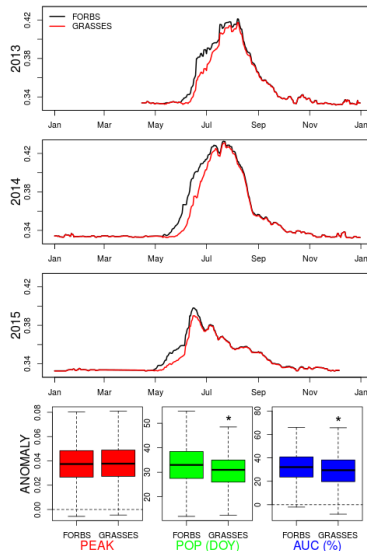
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outlook: growth forms sensitivity to heatwave

- ✓ phenocam spatial analysis (**phenoxip R package**, Filippa *et al.* 2015) can be used to infer the spatial distribution of phenologically different growth forms (i.e. grasses and forbs)



- ✓ both **grasses** and **forbs** are affected by the heatwave but **forbs** show a higher sensitivity: earlier peak and AUC reduction (t-test $p < 0.05$)



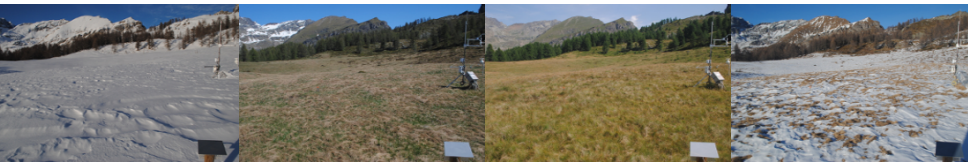
Conclusions

- ✓ GCC tracks not only phenology, but also **heatwave impact on functional and structural canopy properties**
- ✓ **High temperature** and **low soil water content** co-determine heatwave impact on GCC
- ✓ Whilst being both affected by the heatwave, **forbs** have been significantly more impacted than **grasses**

Thank you for the attention

e.cremonese@arpa.vda.it

www.arpa.vda.it/climate-change-impacts



variables grouping (hierarchical and pam clustering)

3 clusters

