A photograph of two deer standing in a field of tall grass and brush. The deer on the left is facing right, and the deer on the right is facing forward. Three speech bubbles are overlaid on the image: one on the left, one above the right deer, and one below the left deer.

So this talk is **not about me?**

No, listen: it's about **finding the best approach for detecting small quantities of invasive plant species** using imaging spectroscopy!

It's about us!

**Sandra Skowronek**<sup>1,2</sup>

Gregory P. Asner<sup>2</sup>

Hannes Feilhauer<sup>1</sup>

<sup>1</sup> University of Erlangen-Nürnberg, Germany

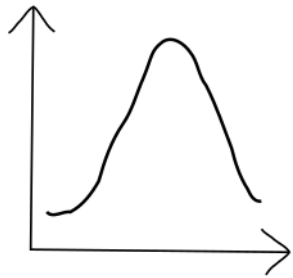
<sup>2</sup> Carnegie Institution for Science, Stanford, CA



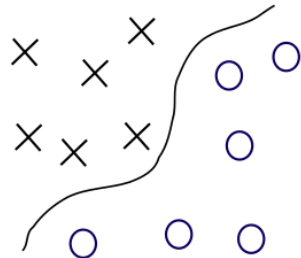
# Aims and scope

- Can we detect small quantities of invasive plant species?
- Which classifier performs best?

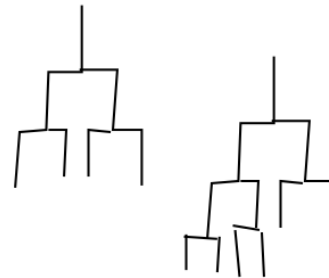
**Maxent**



**Support Vector  
Machines (SVM)**



**Boosted regression  
trees (BRT)**



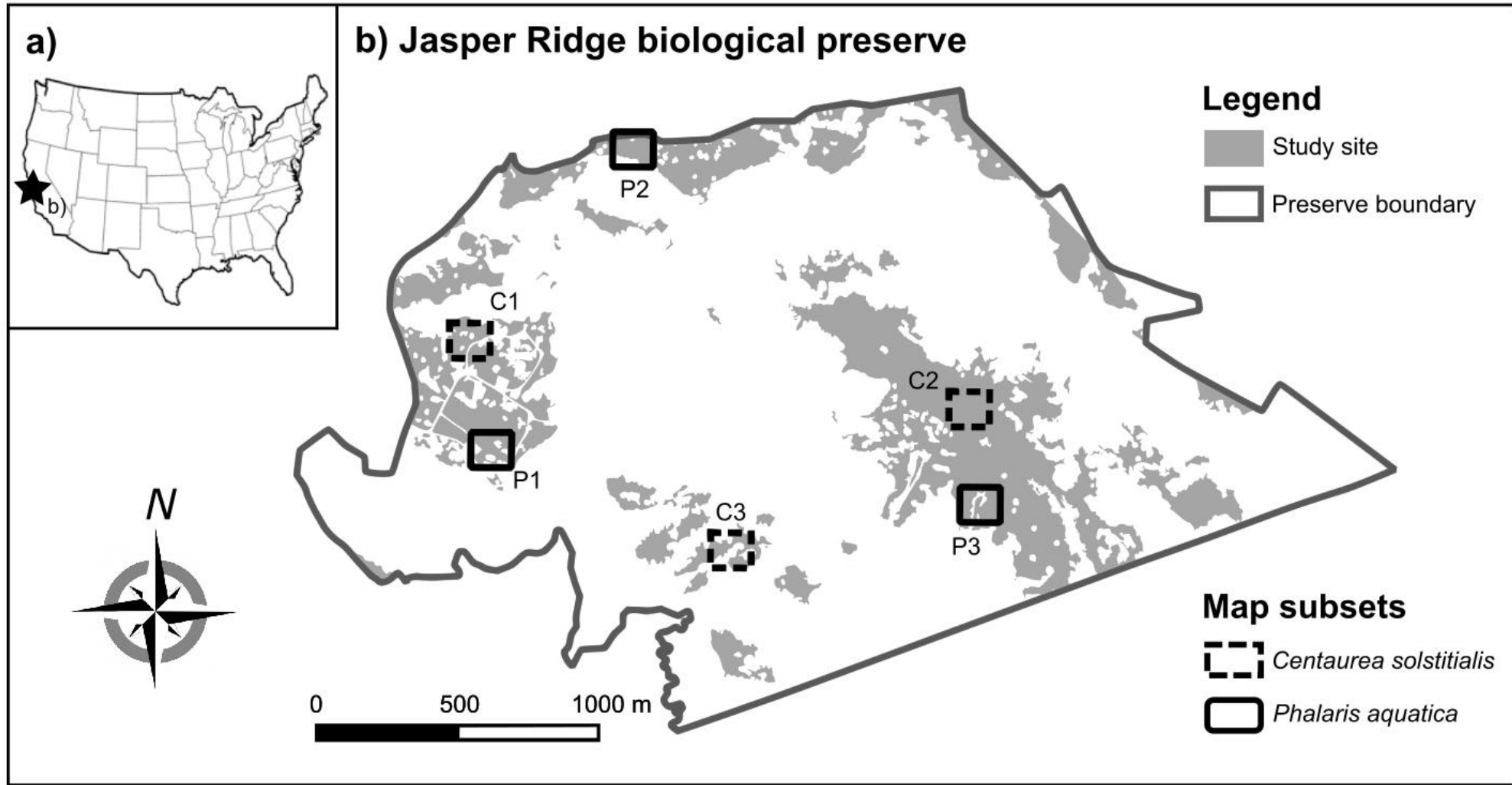
*Centaurea solstitialis*



*Phalaris aquatica*

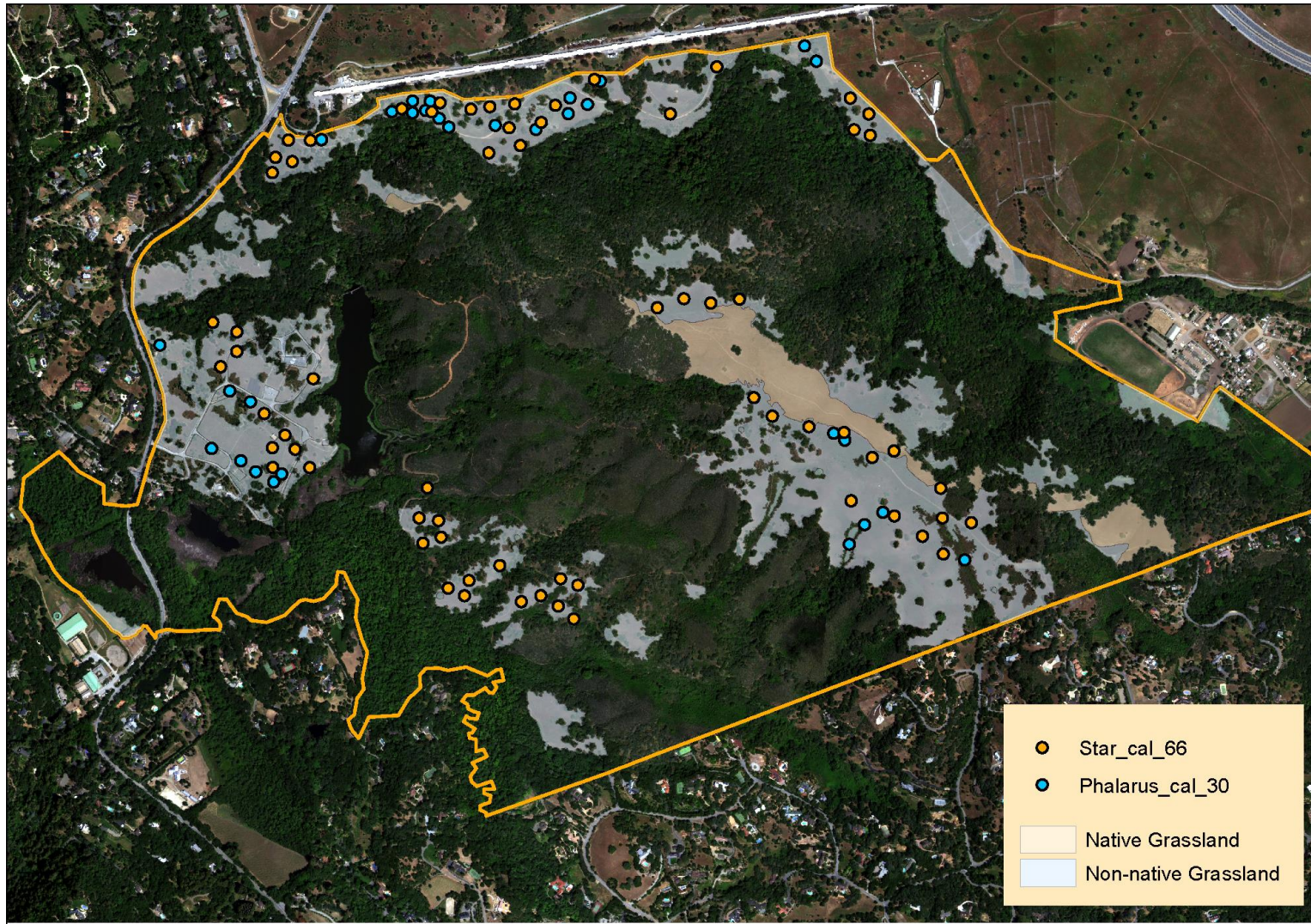


# Study area





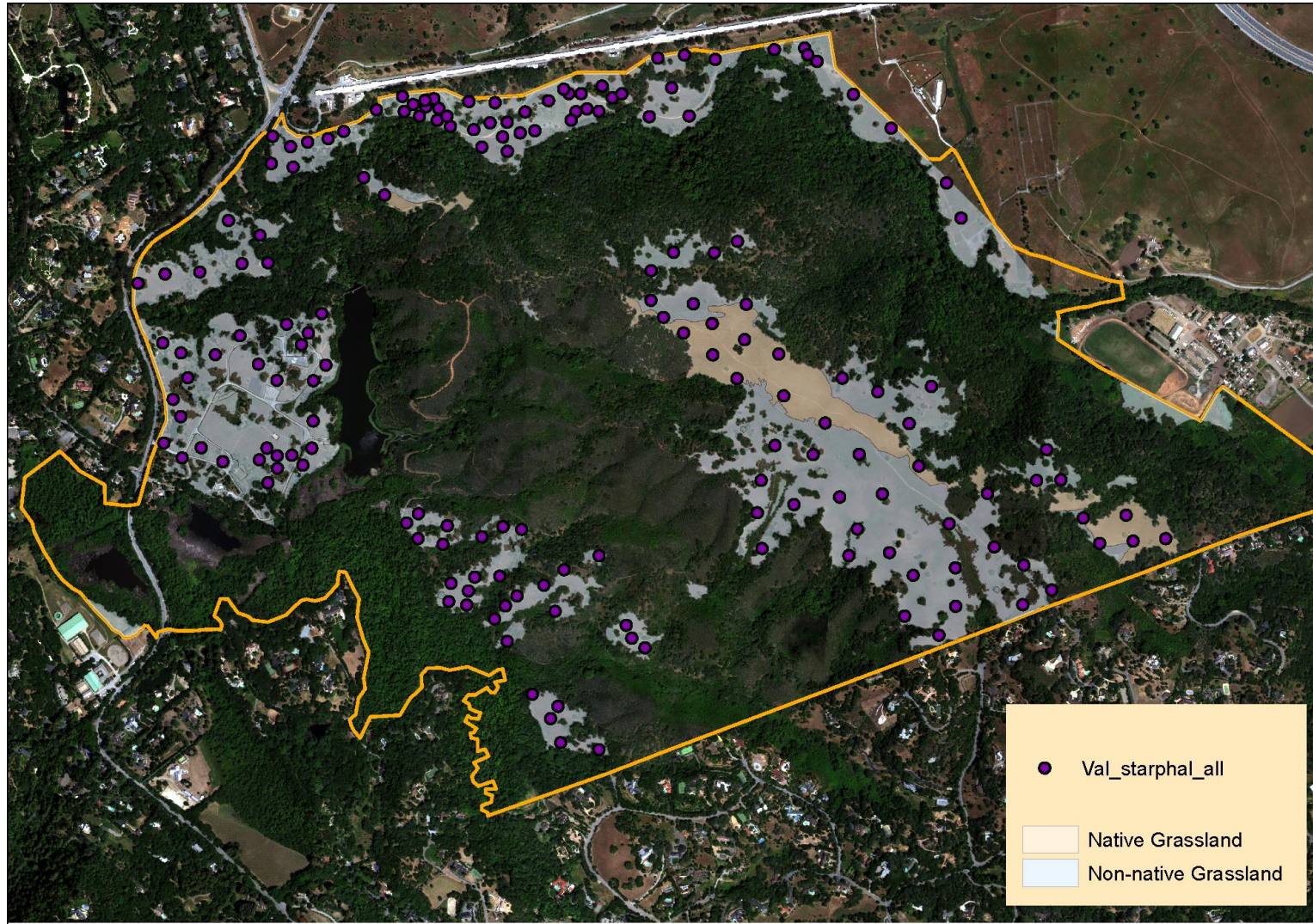
# Field data - calibration



- ▶ 3 m x 3 m plots
- ▶ 66 plots Starthistle
- ▶ 33 plots Phalaris



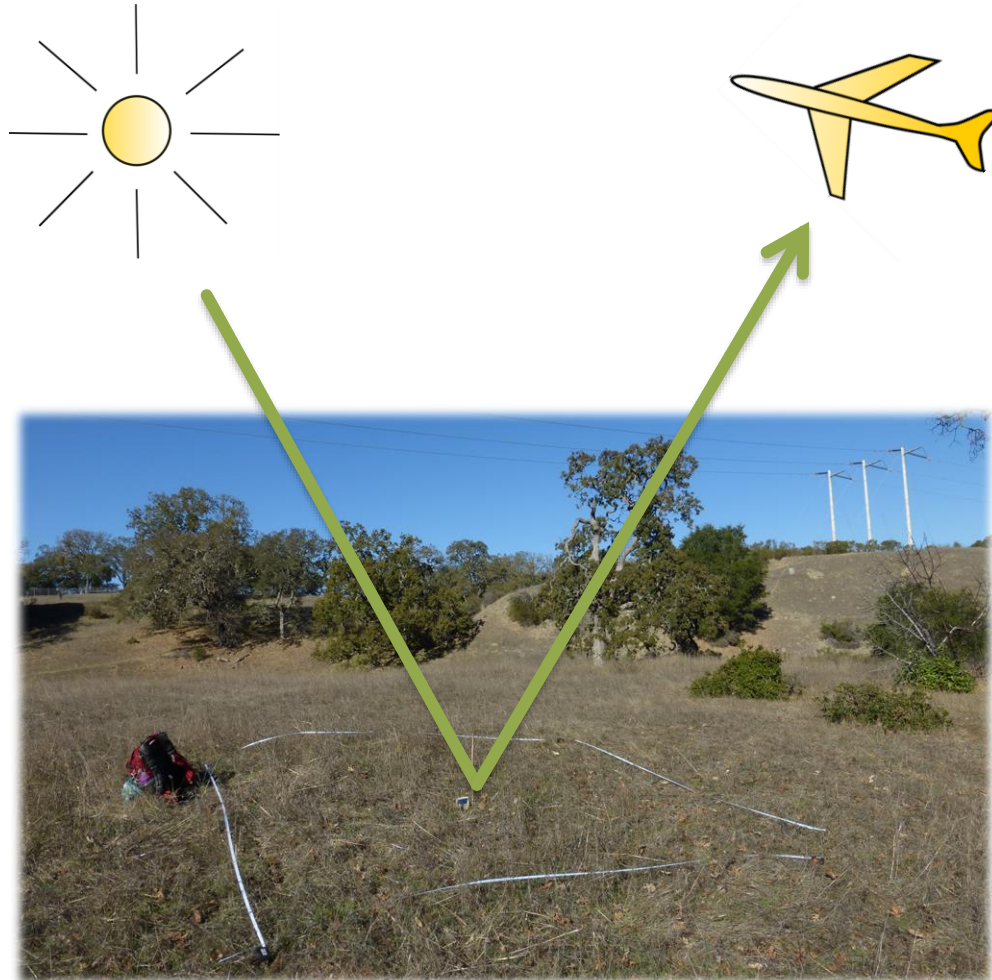
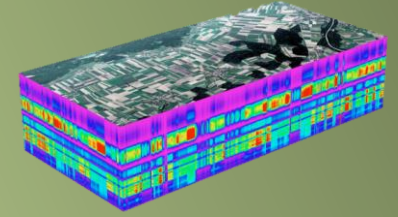
# Field data - validation



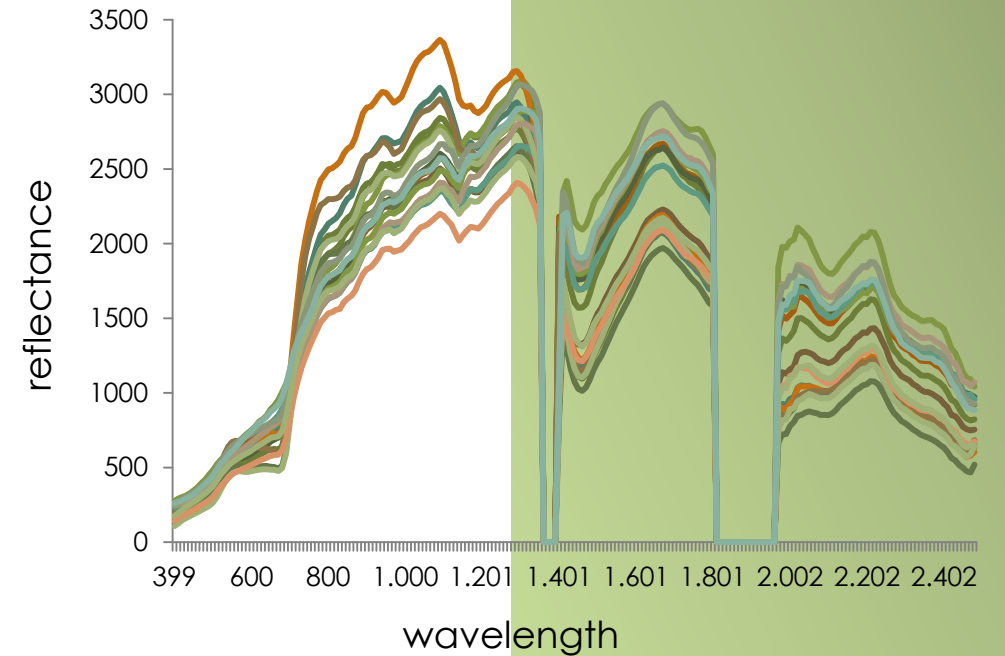
- ▶ 3 m x 3 m plots
- ▶ total of 173 plots



# Hyperspectral remote sensing data



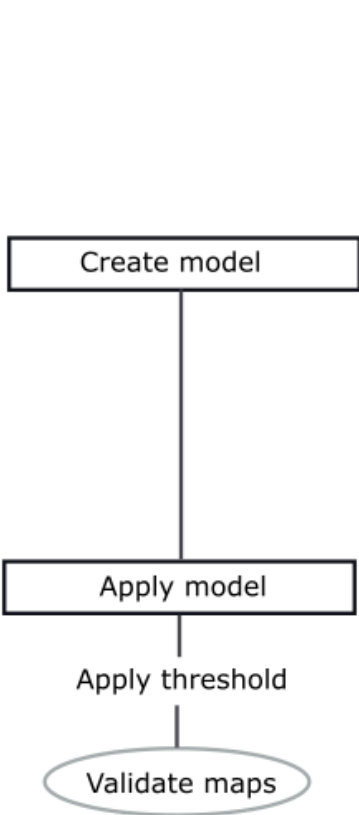
- 168 spectral bands
- 400-2500 nm
- 1 m x 1 m pixels
- 6th of May 2014



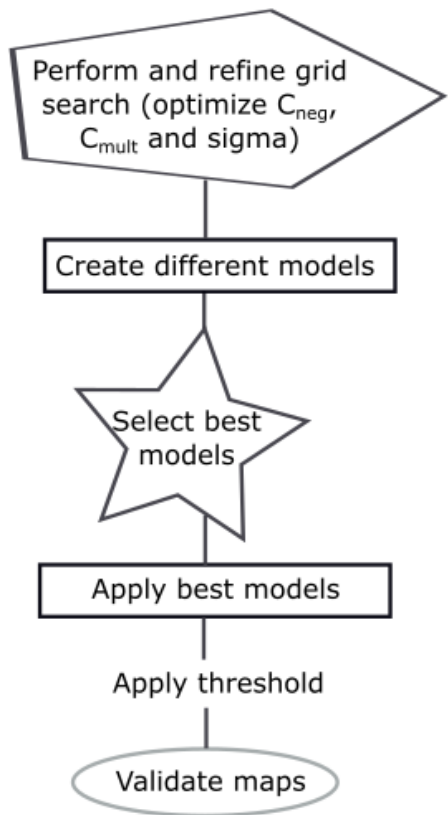


Imaging spectrometer data  
Calibration plots | Background points  
Data tables with extracted spectra

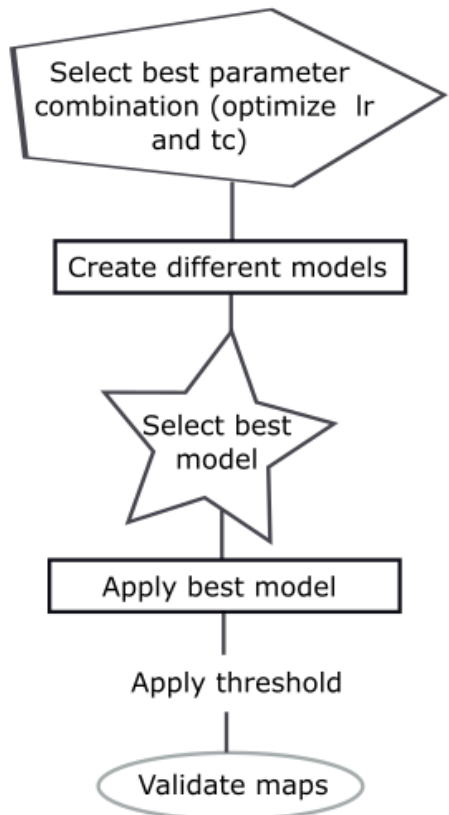
**Maxent**



**biased SVM**



**BRT**

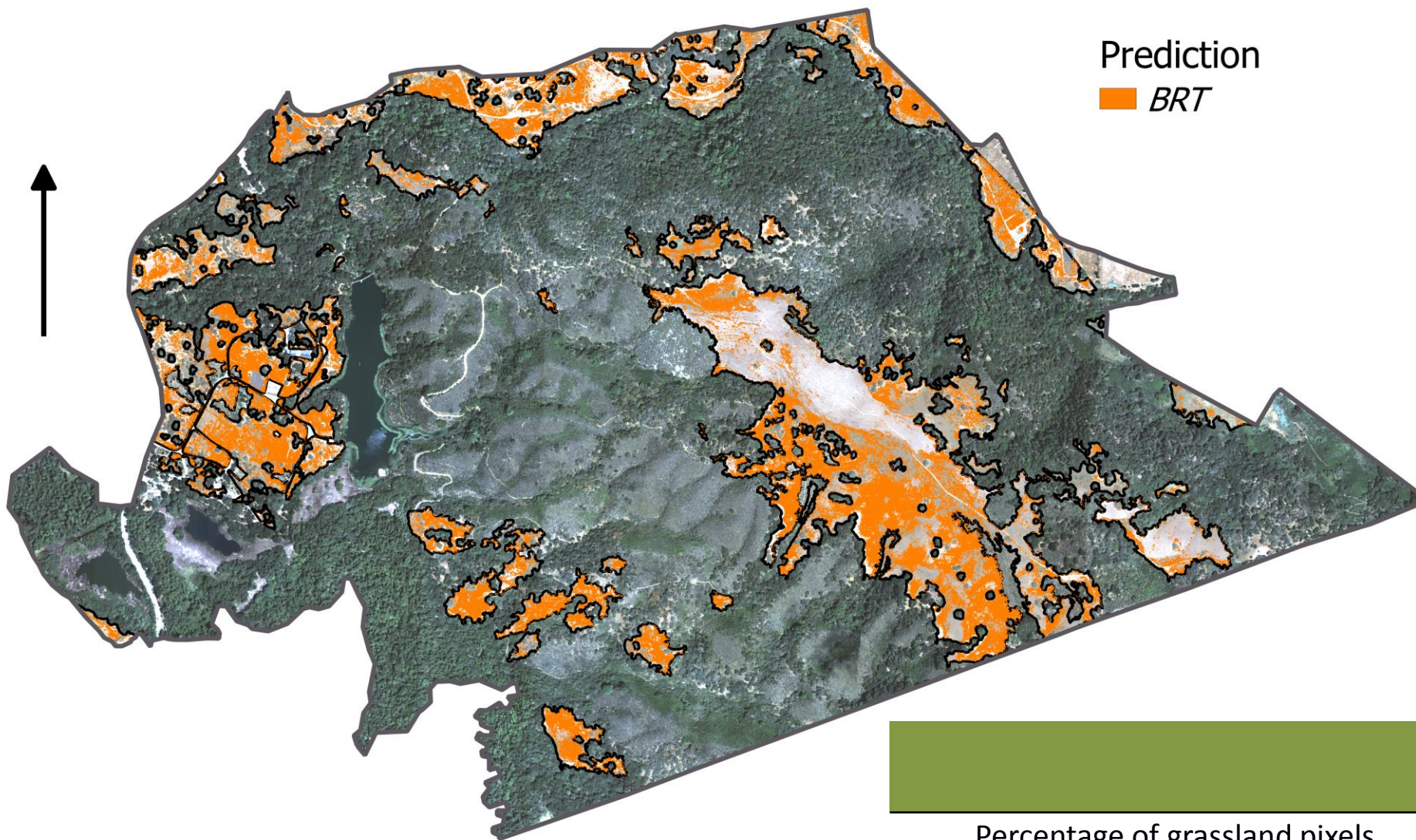


Model comparison

workflow



# *Centaurea solstitialis*

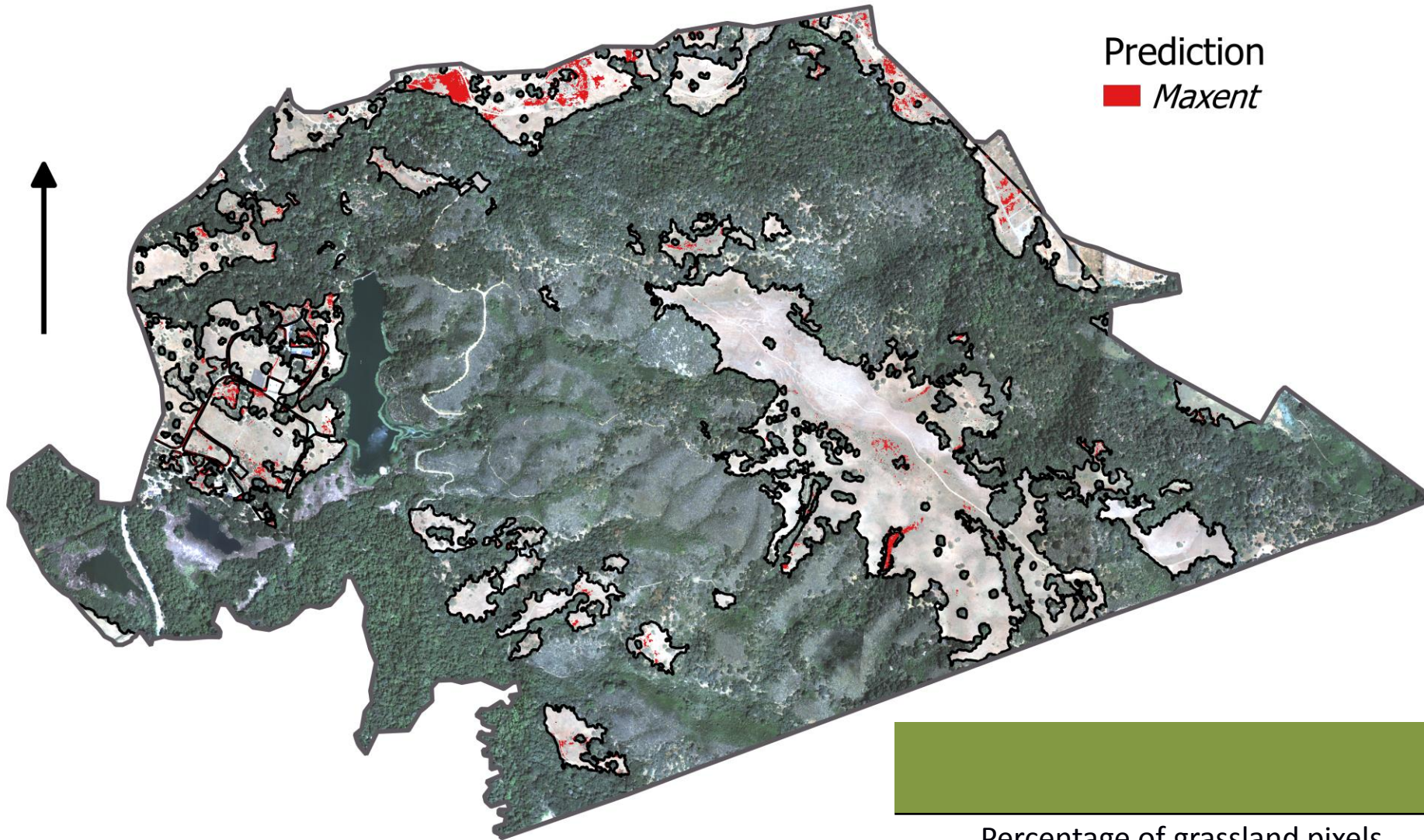


## predictions

	Max-ent	Biased SVM	BRT
Percentage of grassland pixels with <i>Centaurea solstitialis</i>	46.2	40.3	41.1



*Phalaris aquatica*



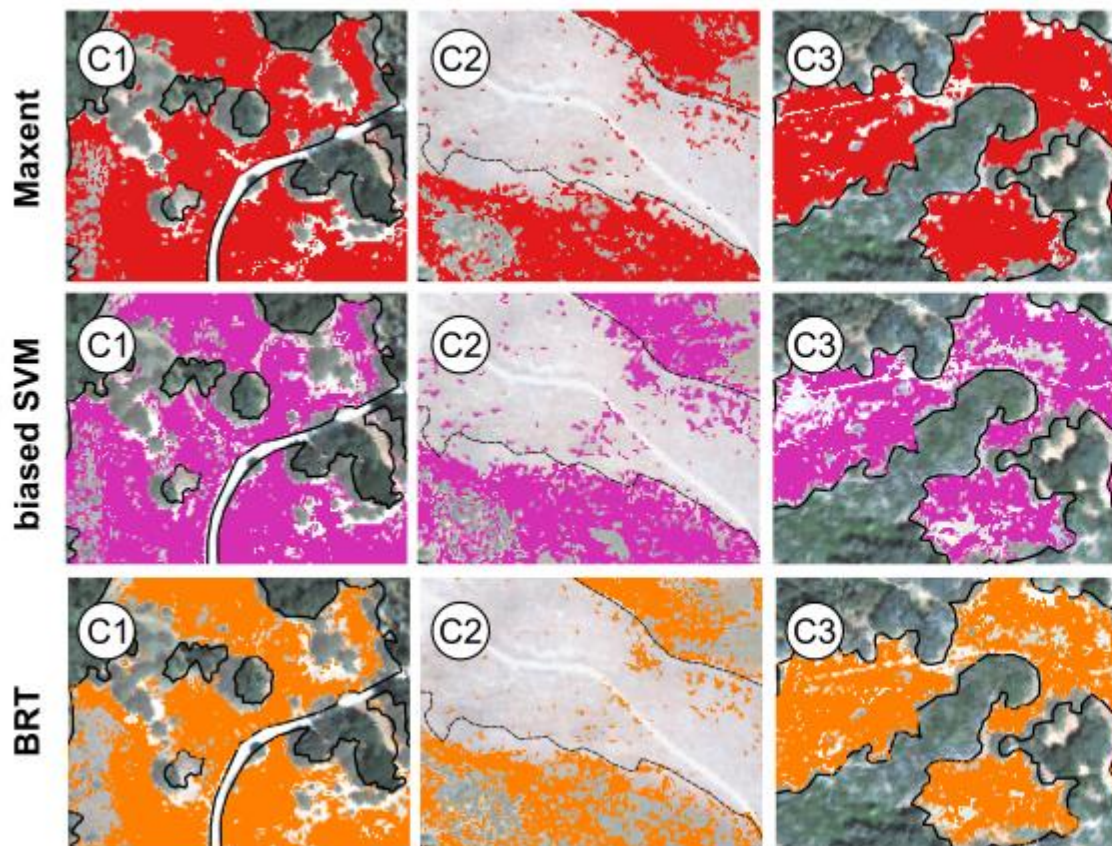
predictions

	Max-ent	Biased SVM	BRT
Percentage of grassland pixels with <i>Phalaris aquatica</i>	3.8	7.2	3.0

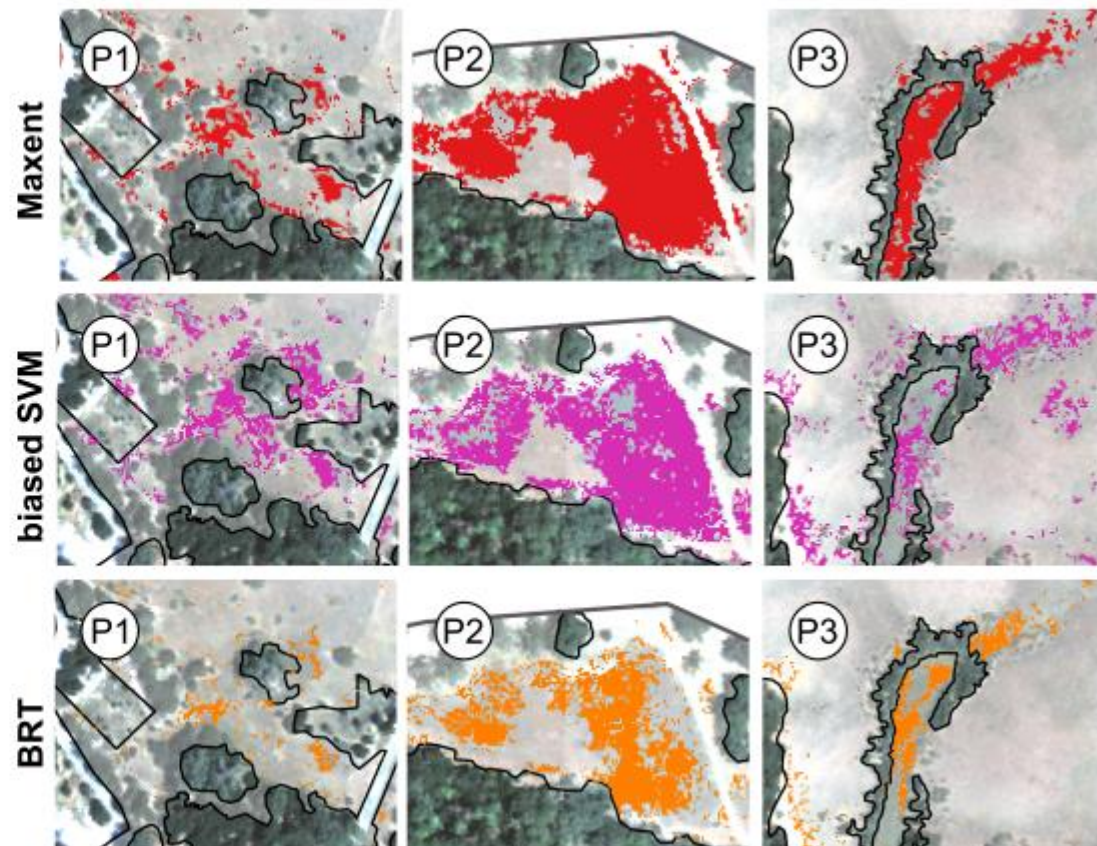


# Subsets

a) *Centaurea solstitialis*



b) *Phalaris aquatica*





# Confusion matrices - *Centaurea solstitialis*

	Maxent			SVM			BRT	
	<i>0 - pred</i>	<i>1 - pred</i>		<i>0 - pred</i>	<i>1 - pred</i>		<i>0 - pred</i>	<i>1 - pred</i>
<i>0 - field</i>	<b>35 (TN)</b>	32 (FP)	<i>0 - field</i>	<b>44</b>	23	<i>0 - field</i>	<b>47</b>	20
<i>1 - field</i>	11 (FN)	<b>88 (TP)</b>	<i>1 - field</i>	23	<b>76</b>	<i>1 - field</i>	25	<b>74</b>
Overall accuracy	0.74			0.72			0.73	



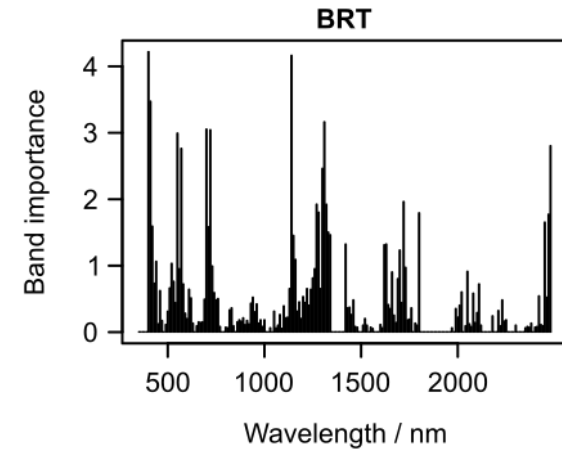
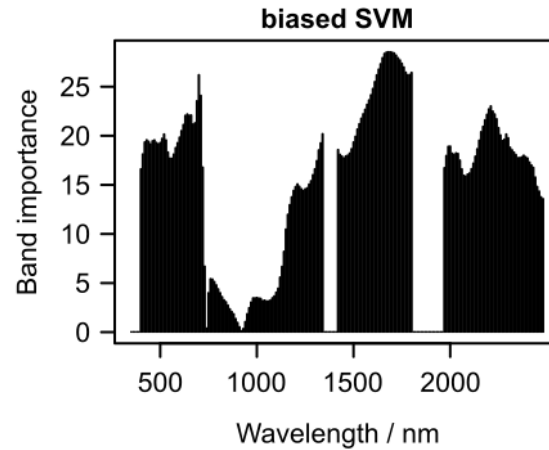
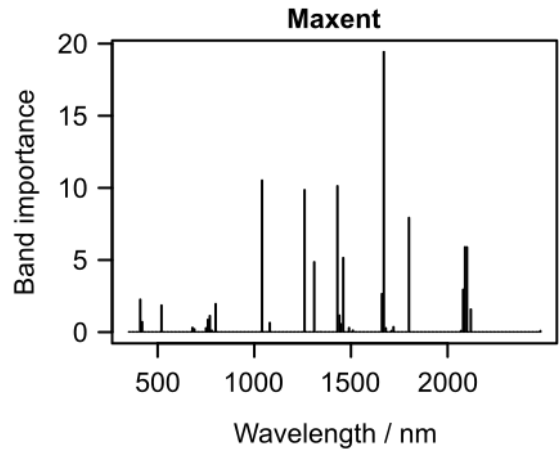
# Confusion matrices - *Phalaris aquatica*

	Maxent			SVM			BRT	
	<i>0 - pred</i>	<i>1 - pred</i>		<i>0 - pred</i>	<i>1 - pred</i>		<i>0 - pred</i>	<i>1 - pred</i>
<i>0 - field</i>	<b>137</b>	6	<i>0 - field</i>	<b>128</b>	15	<i>0 - field</i>	<b>139</b>	4
<i>1 - field</i>	15	<b>15</b>	<i>1 - field</i>	14	<b>16</b>	<i>1 - field</i>	16	<b>14</b>
Overall accuracy	0.88			0.83			0.88	

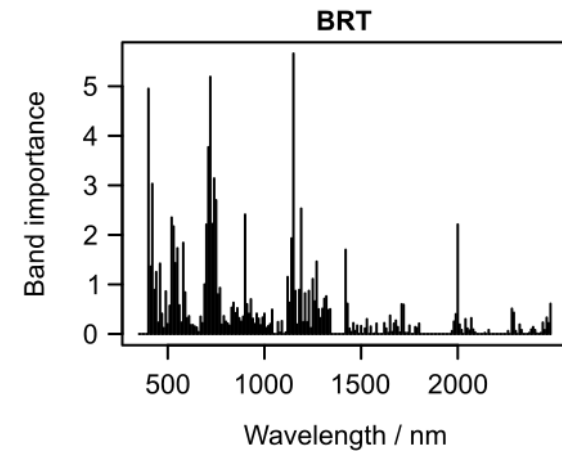
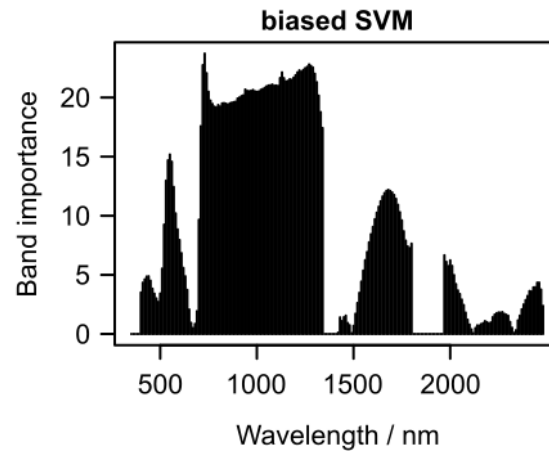
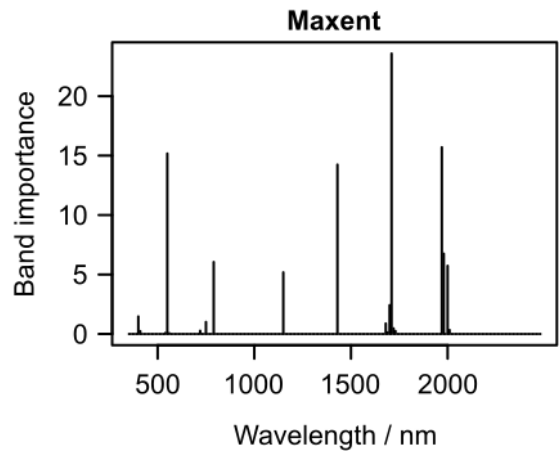


# Band importances

## a) *Centaurea solstitialis*

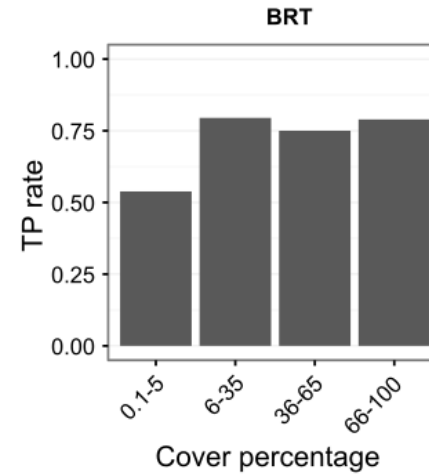
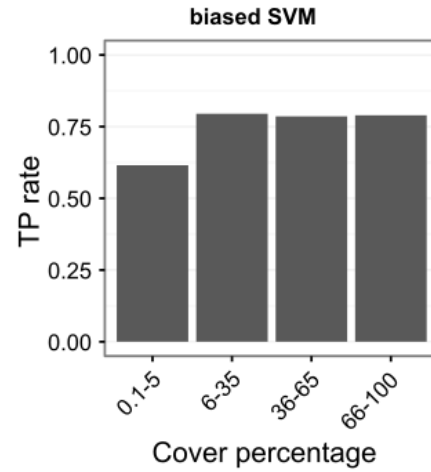
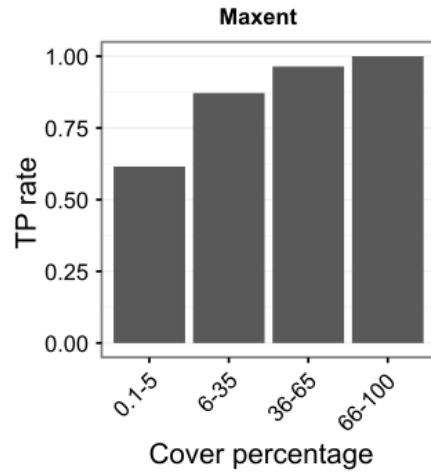


## b) *Phalaris aquatica*

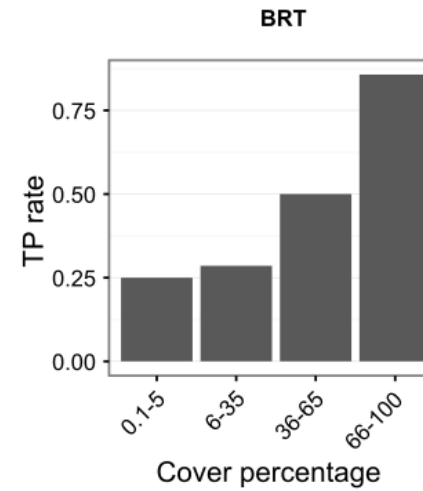
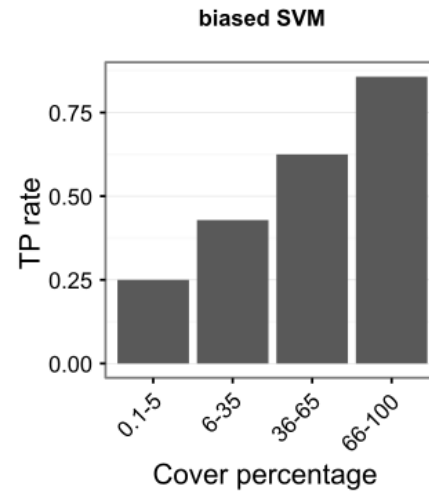
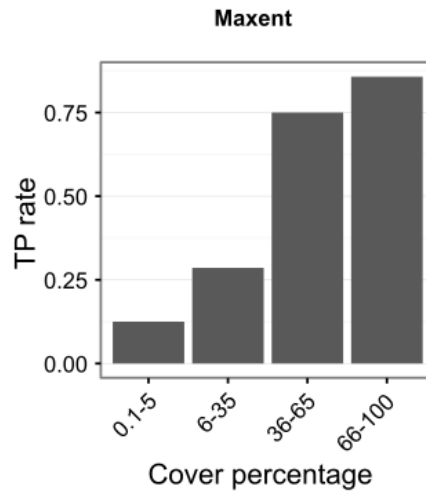


# Mapping small cover fractions?

## a) *Centaurea solstitialis*



## b) *Phalaris aquatica*





A close-up photograph of a starthistle insect, showing its characteristic star-shaped body and long, thin legs. The insect is positioned in the top-left corner of the slide.

# Conclusions

- ▶ We can map both species, but much higher success of mapping small cover fractions for Starthistle
- ▶ Similar overall performance of different classifiers, but some differences in predictions and use of different band areas





Thanks for your attention!



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