



Integrating camera traps, remote sensing and citizen science to improve ecological forecasting

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Balancing Act of Wildlife Management

Monitor animal populations
Deliver information to stakeholders
Forecast changes in populations



Partnership to monitor wildlife
year-round through a statewide
network of trail cameras



Potential of Snapshot Wisconsin



Improve accuracy of population estimates

Fawn-to-doe ratios based on roadside, opportunistic sampling

Increase coverage & reduce costs

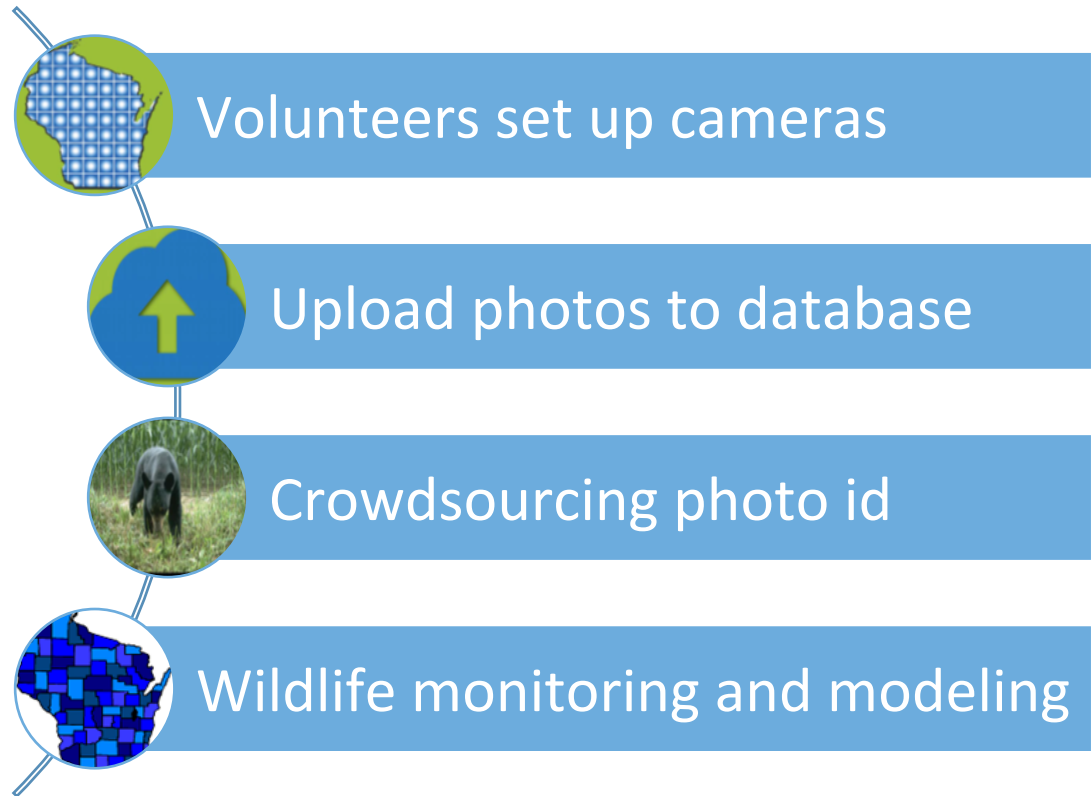
Aerial surveys limited by weather, cost, logistics

Less need for invasive methods

Baiting, trapping, harvest records



Citizen Science



Citizen Science

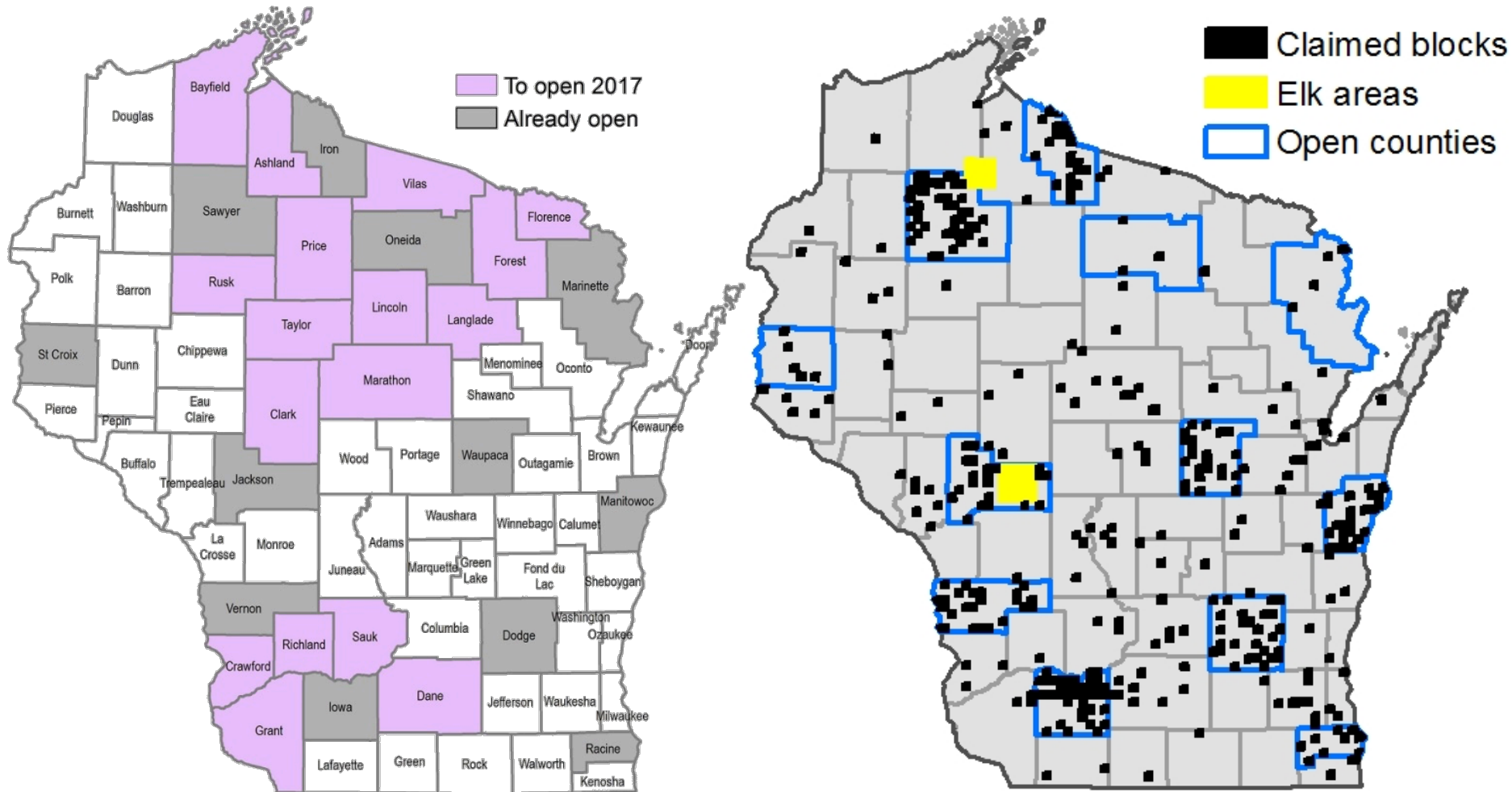


Volunteers receive training
Free equipment
DNR staff



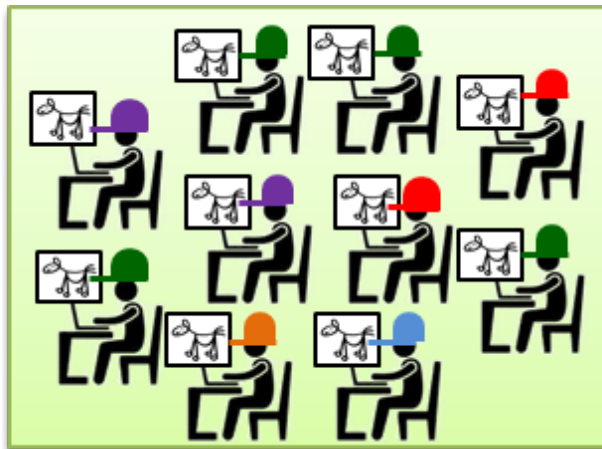
Motion-activated
Photos of 3 with 15-second lag
Encrypted, date/time programmable

600 volunteers 800 cameras 10 million photos

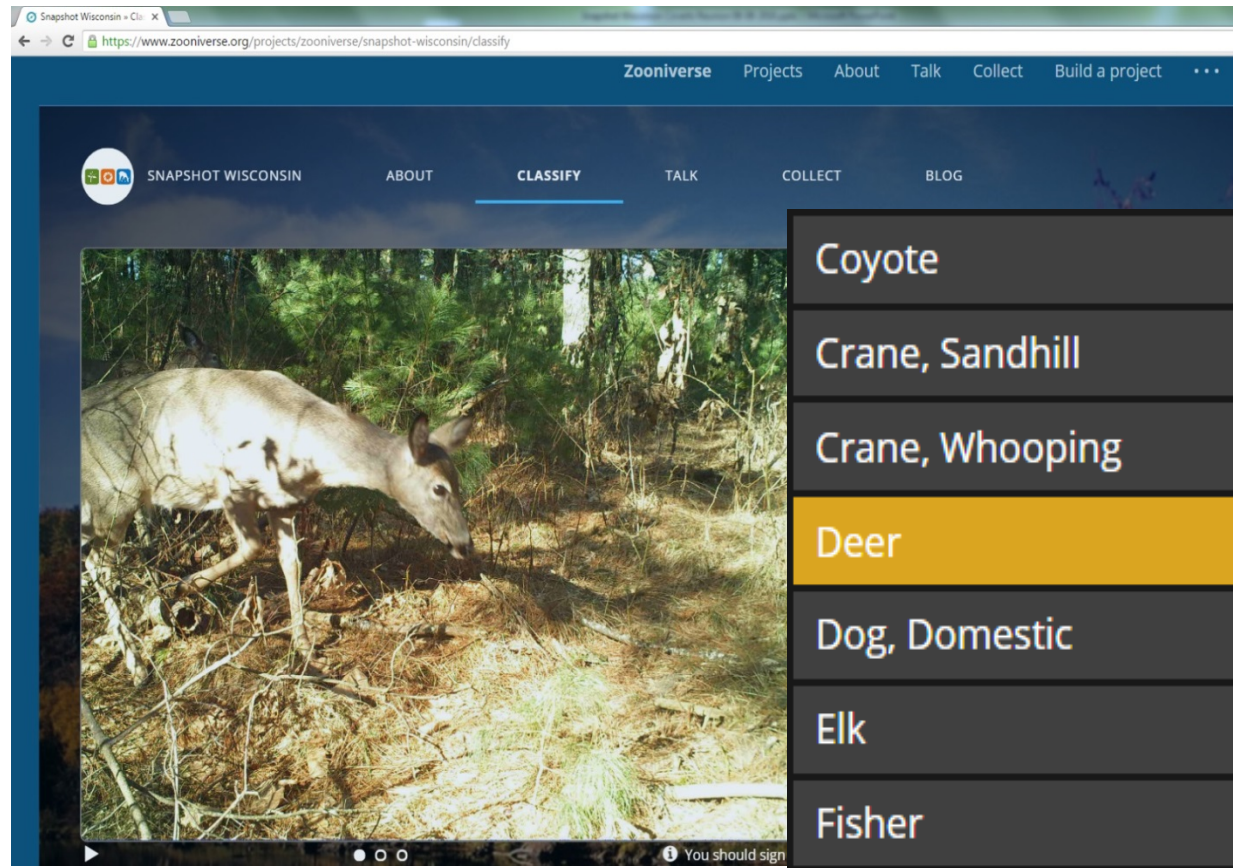


Crowdsourcing with Zooniverse

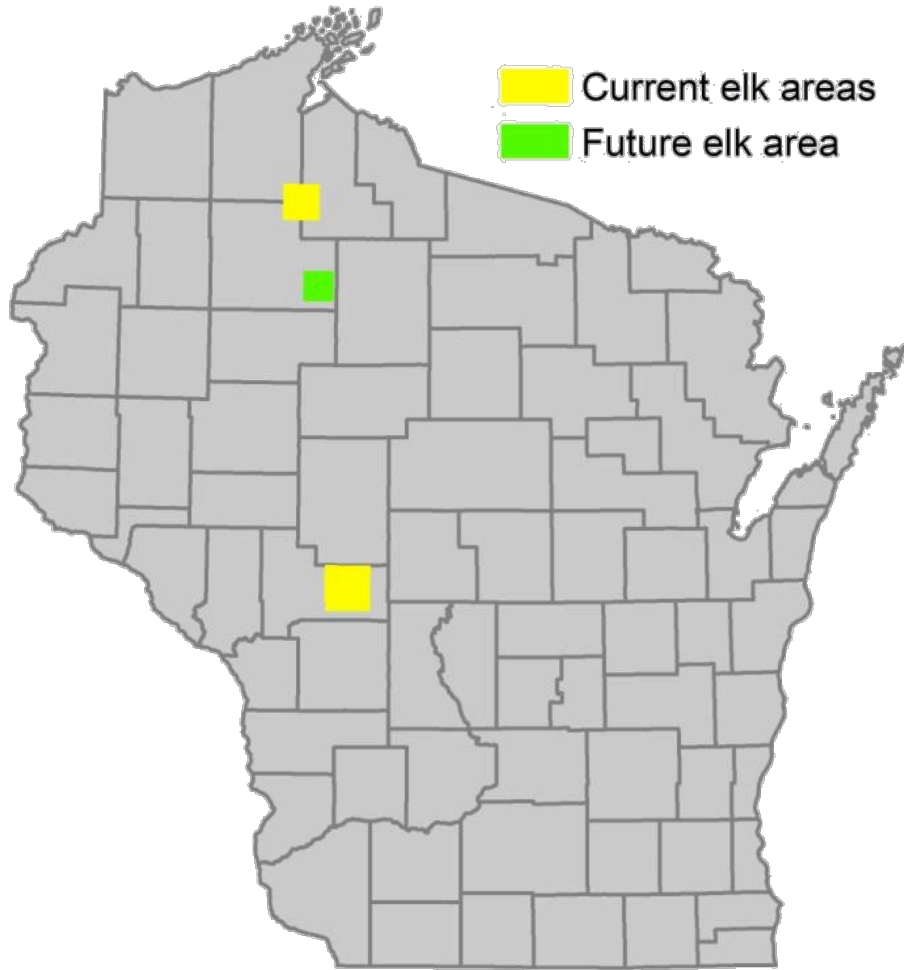
5,000 volunteers **1 million** classifications
Online Global Community



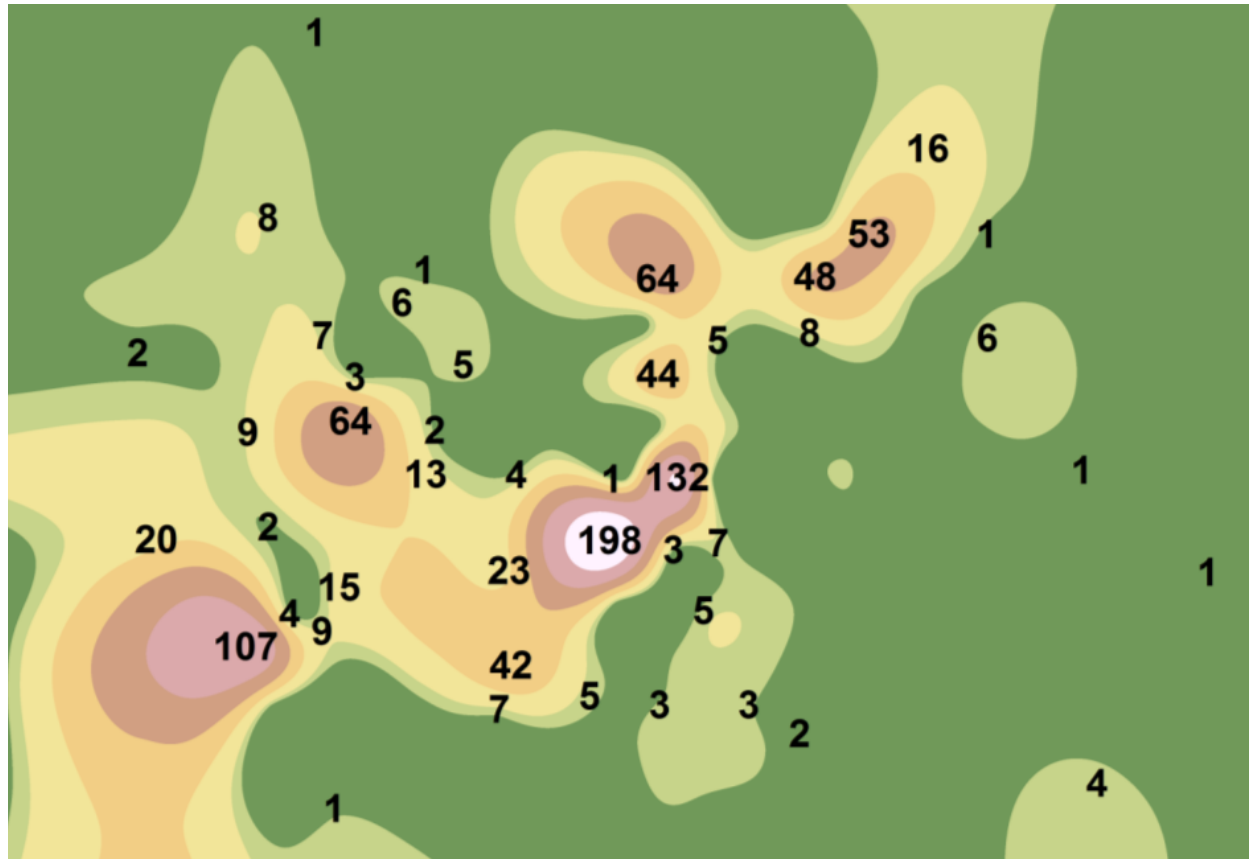
snapshotwisconsin.org



Applications: Elk Reintroduction

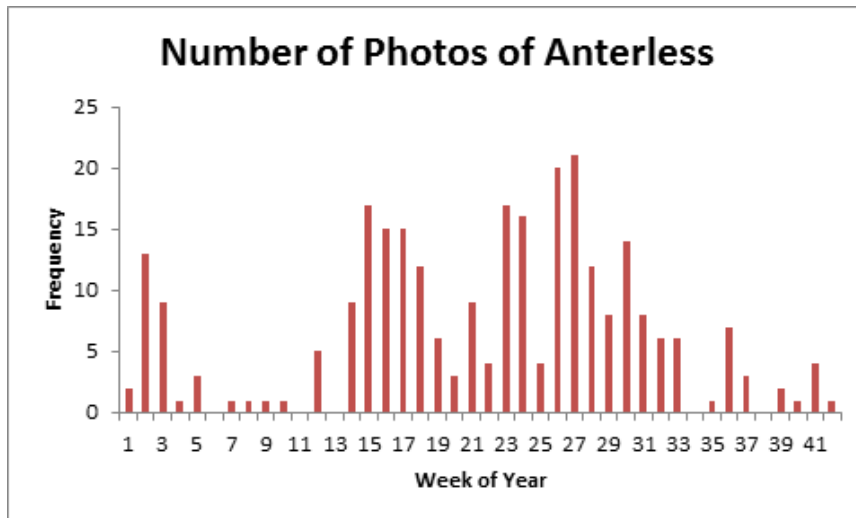
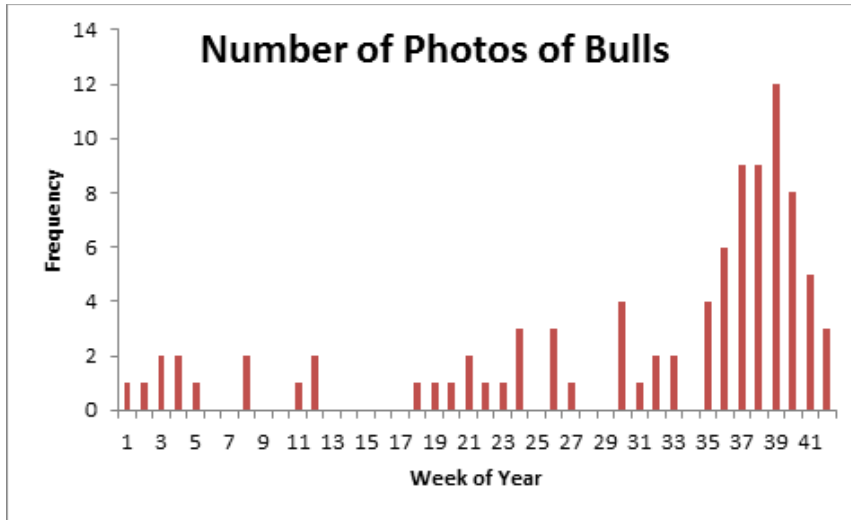


Elk Sightings



For cameras active July
17 – Oct 5, 2015

Patterns of Activity



Recruitment

Elk (Calf-to-Cow Ratios)

2015/16 = 0.47



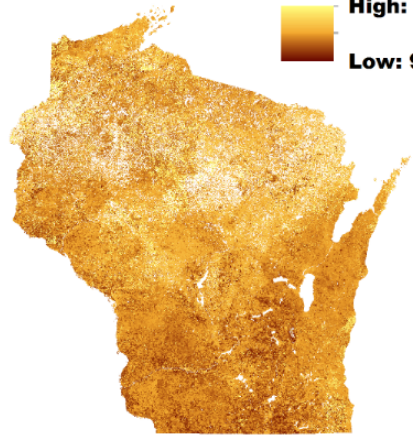
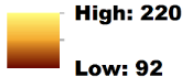
Deer (Fawn-to-Doe Ratios)

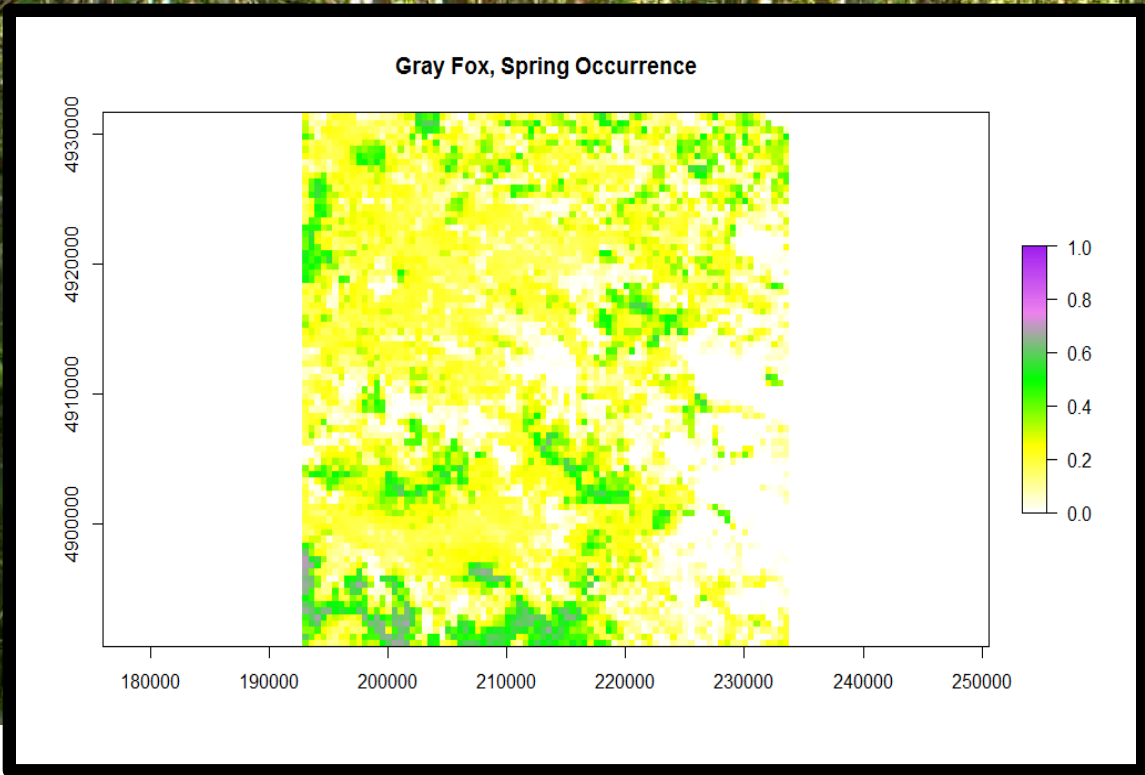
2015/16 = 0.7 to 1.0



Species Distribution Modeling

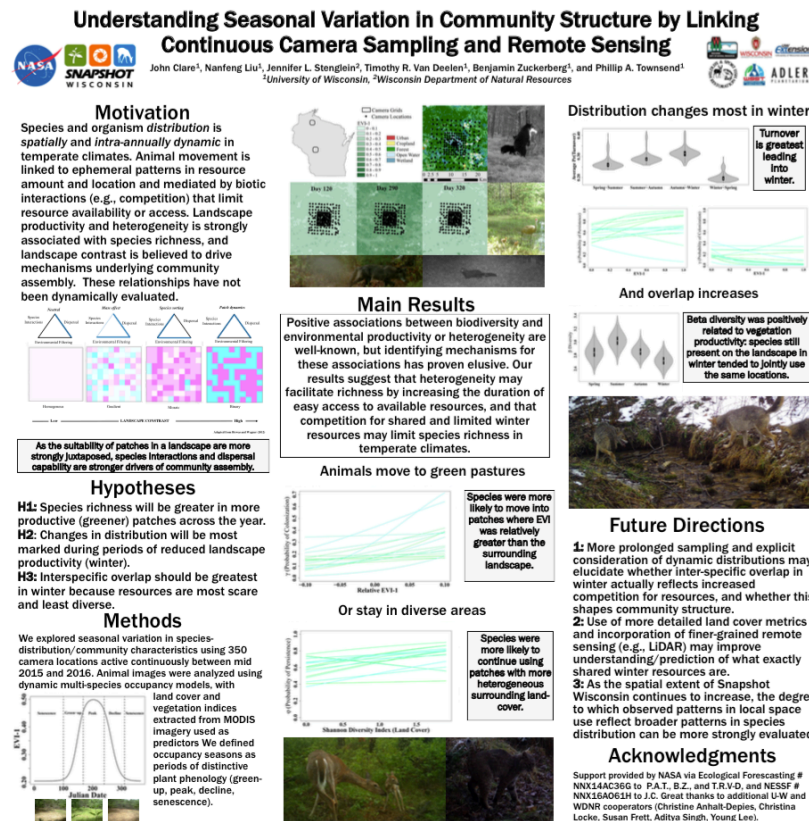
Length of Season



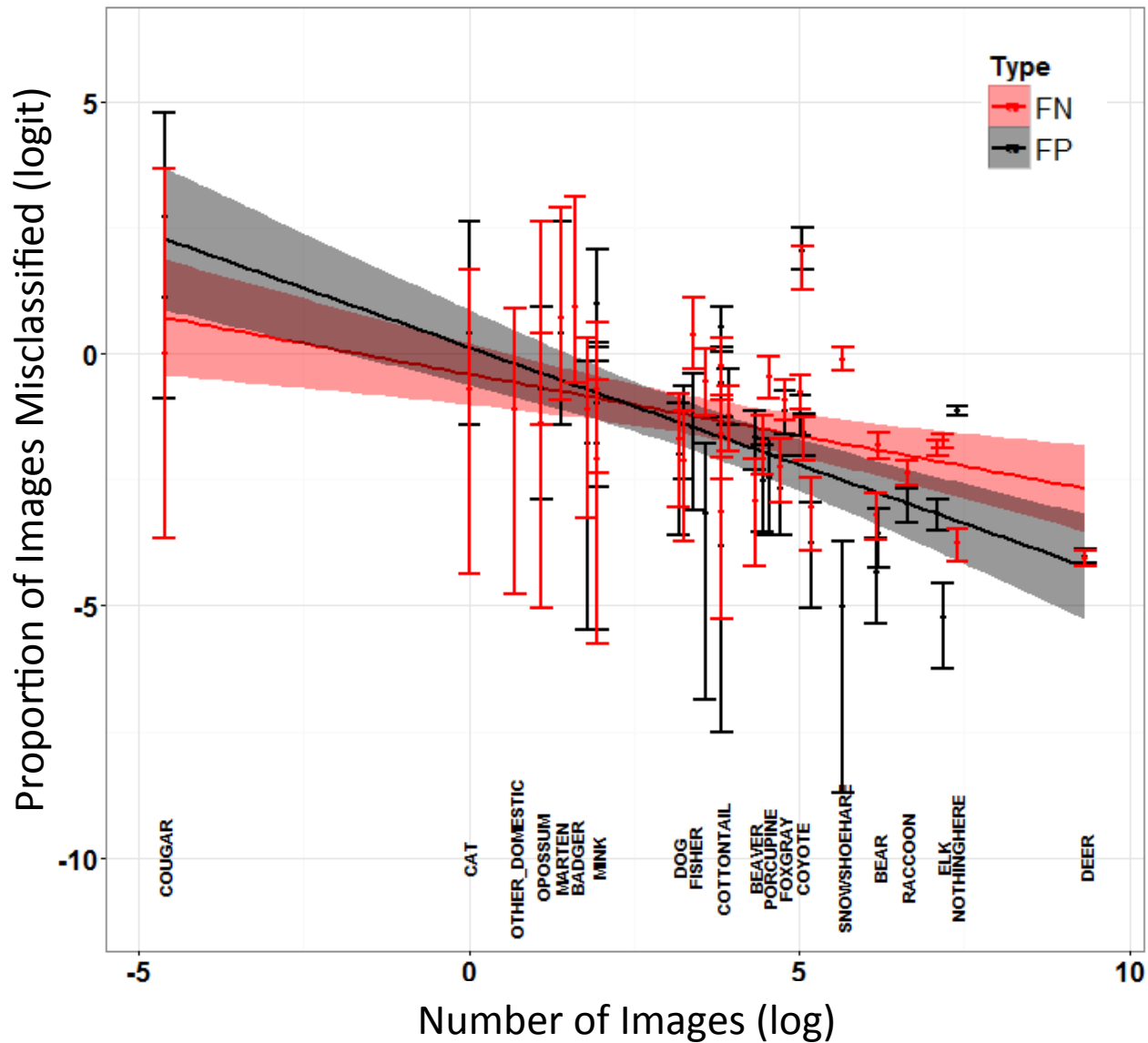


See John Clare (NESSF student) Poster

More on the use of remote sensing to predict animal community patterns as a function of vegetation dynamics:



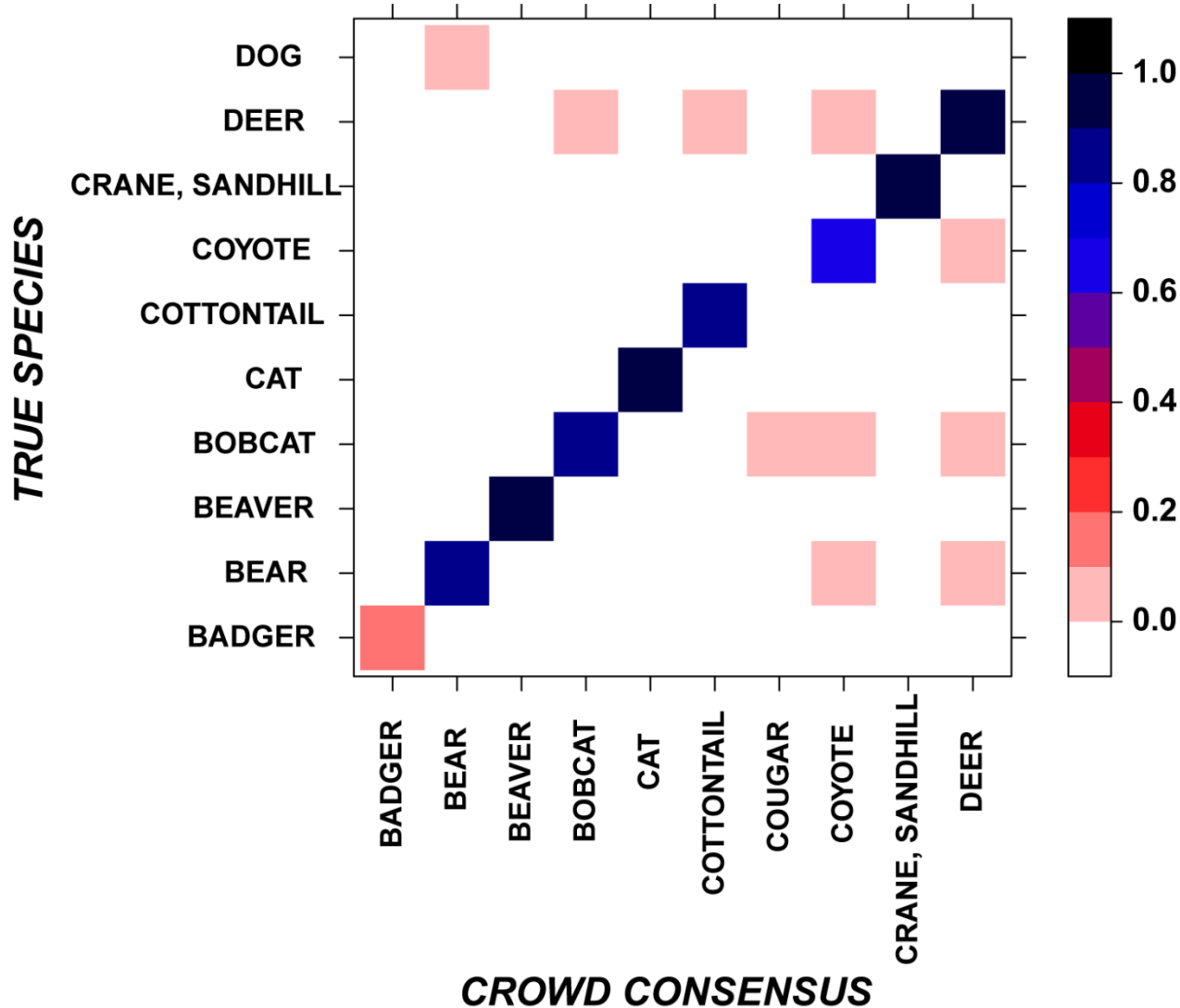
Classification Accuracy



Comparison of expert vs. crowdsourced classification

Less common species have higher classification error

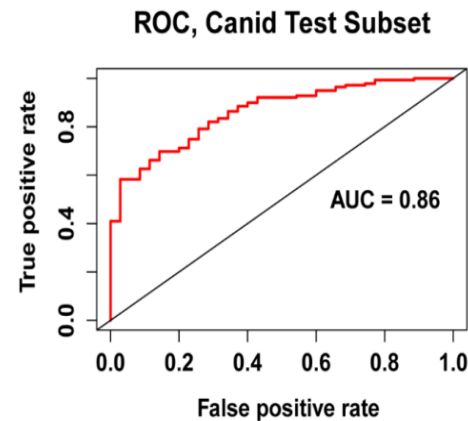
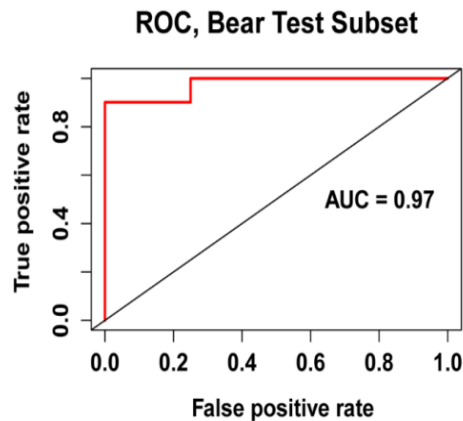
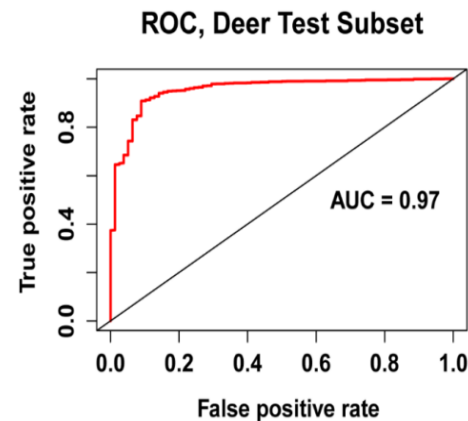
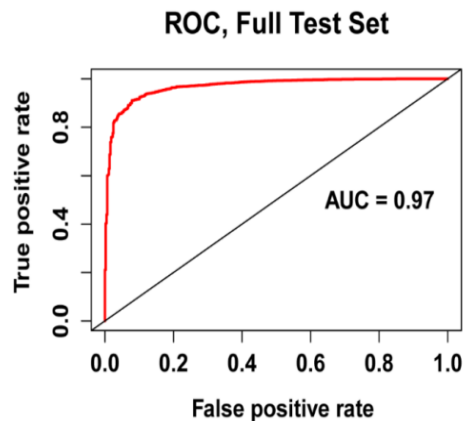
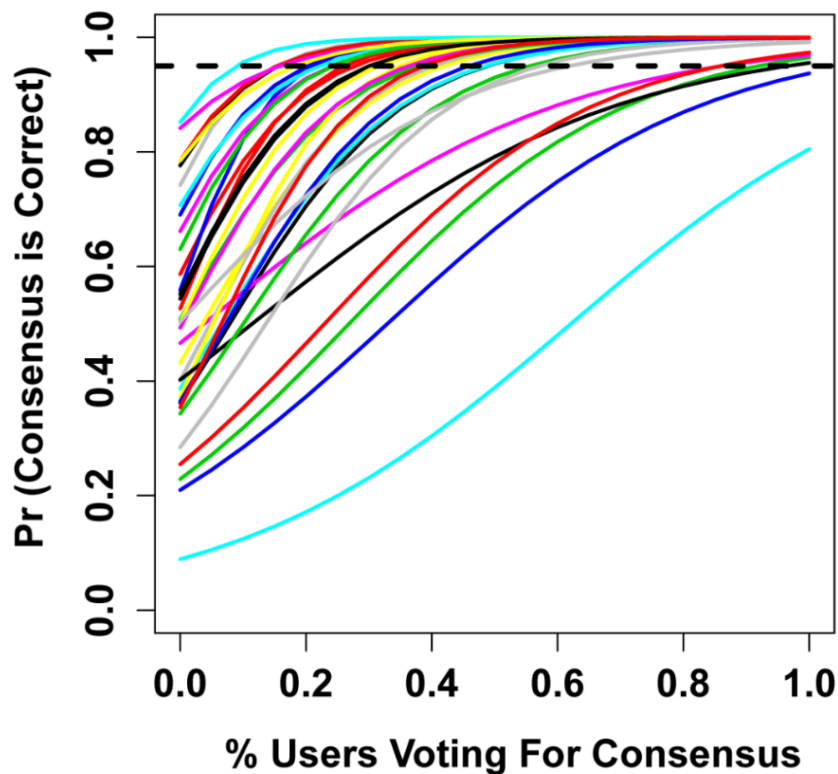
Classification Accuracy



Comparison of expert vs. crowdsourced classification

Error is not equally distributed across species

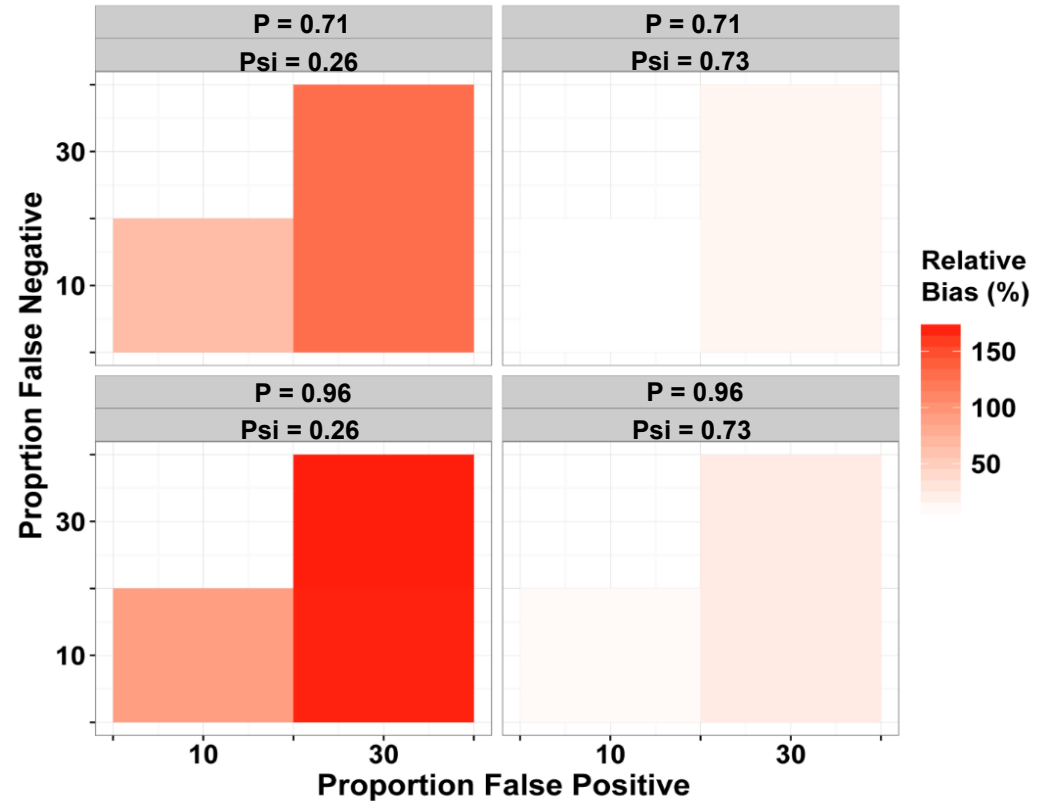
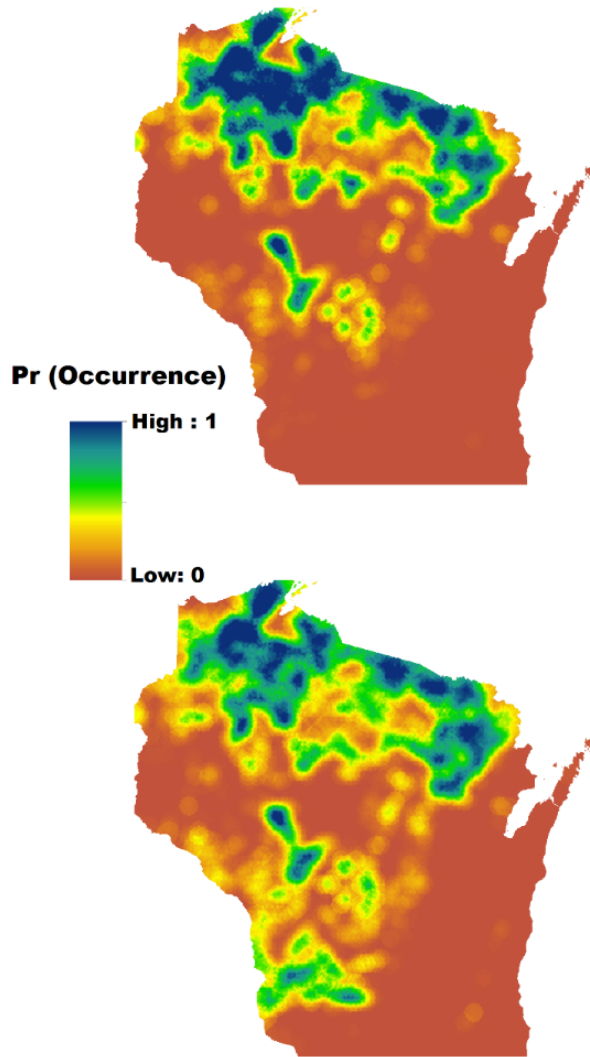
Classification Accuracy



More people agree, the more likely it is that the consensus is correct

Strong predictability of whether a given image is correctly classified

Distribution Modeling



Rare species have greater rates of false positive classification and high bias

Volunteer Motivation



94%

Of volunteers are property owners (n = 52)



73%

Of volunteers are male (n = 54)
with an average age of 61 (range 25-75, n = 52)



60%

Of volunteers identify as a hunter (n = 55)



40%

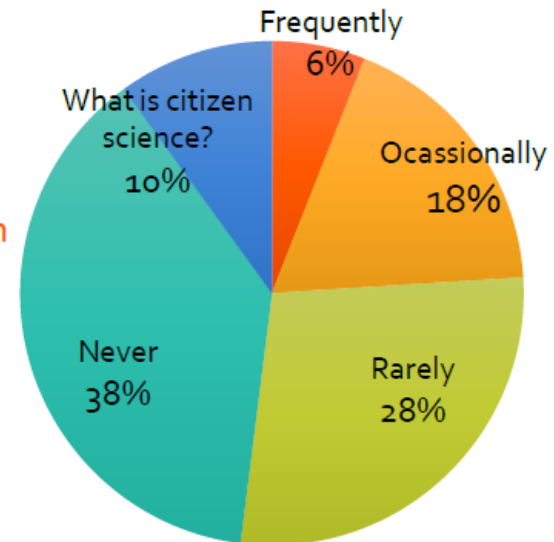
Of volunteers have a graduate degree or more (n = 52)



To hopefully aid the DNR & public in understanding wildlife populations more accurately.

I want to know what is on my land. Have always wanted a trail cam—curiosity.

How often do you participate in citizen science?



n= 50

Agency Partner: Wisconsin DNR

Fully bought-in

This is their show already!

3 fulltime staff

>\$1,000,000 spent (staff, IT infrastructure, cameras)

Project will be sustained after NASA funding

(full deployment of cameras 2019 – received state pressure to speed up the process – project is viewed as a success)



Lessons Learned

Successes

- Hybrid citizen science
- Inclusion of interest groups
- IT development
- Remote sensing



Challenges

- Computer skills of volunteers
- Data management
 - *long-term, high volume*
- Dealing with “nothing there”



Acknowledgements



Susan Frett
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Dan Storm
John Dadisman
Joe Dittrich



Volunteers
Laura Trouille
Ali Swanson
Sarah Allen



Becky Sapper



Clayton Kingdon
Young Lee
Prabu Ravindran

Trail camera monitoring volunteers
Ho Chunk Nation DNR
Jackson County Forest and Parks
US Forest Service
WDNR staff helping with camera hosting and photo classification























Questions?

