



# LARGE-SCALE MONITORING, EXPERT INPUT, AND THE ECOLOGICAL IMPACT OF AUTONOMY IN AGRICULTURE

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Coordination at Scale Lab, Virginia Tech

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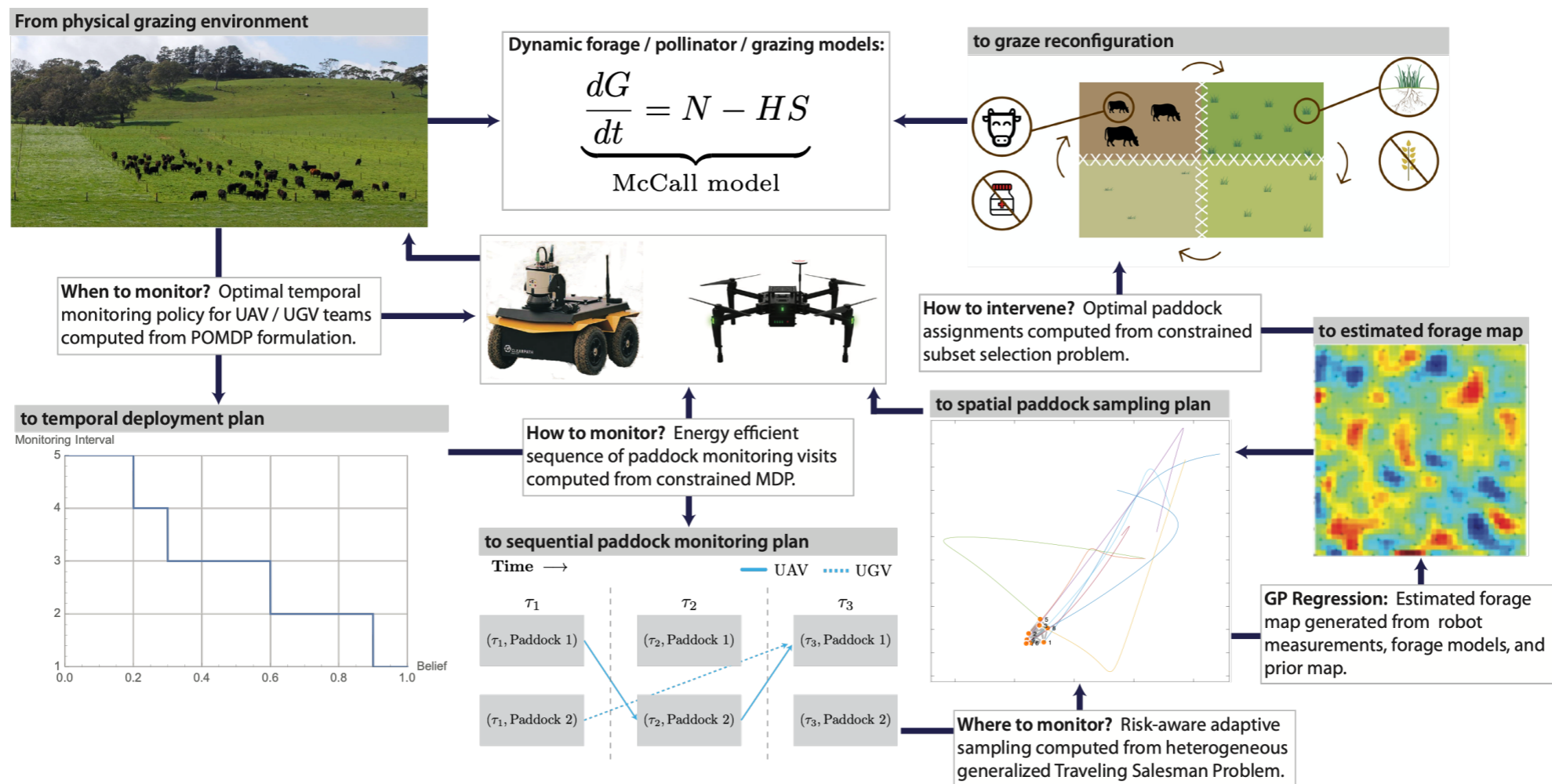
- ▶ CAS Lab started in Fall 2016 at Virginia Tech.
  - ▶ <https://caslab.ece.vt.edu/>
- ▶ Autonomy in large-scale systems.
- ▶ Study relationships between agent-to-agent interaction and scalable coordination.
- ▶ Theory + in-field validation and practical applications.



[UAV Coordination, CAS Lab]



- ▶ CPS: Medium: Multi-Scale Planning in Robot Teams for Persistent Monitoring and Intervention in Precision Grazing
- ▶ Pasturelands are integral to agricultural production in the United States.
  - ▶ Cover approximately 48 million ha providing forage that supports over 54 million head of livestock.



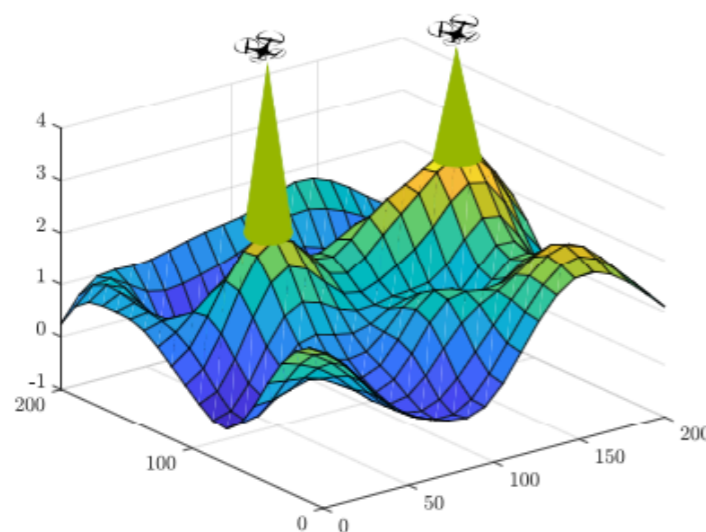
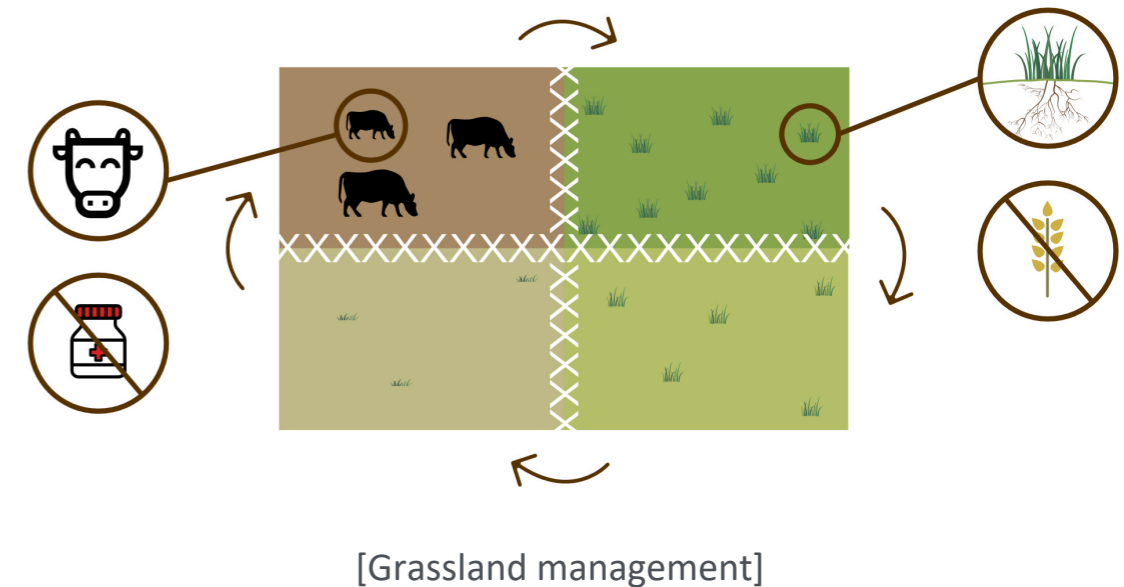
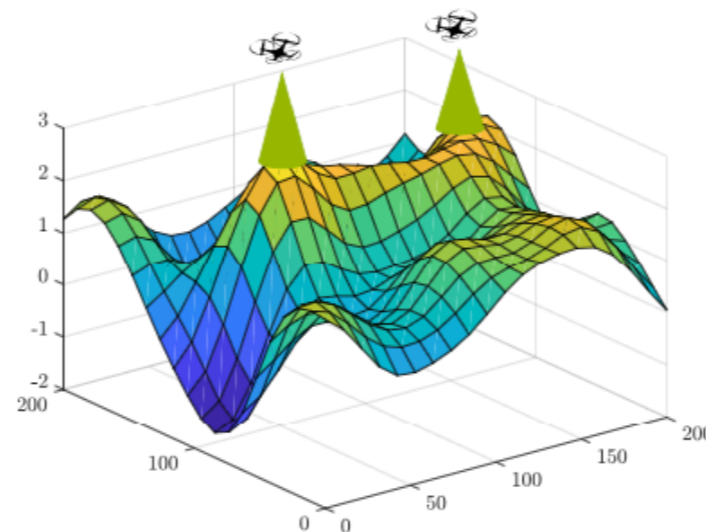
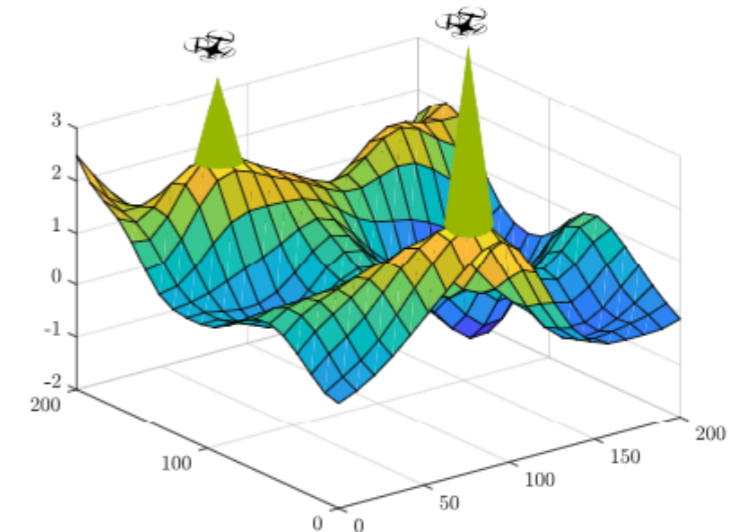
[Autonomy in Precision Grazing]

# What are our current problems and results?

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Large-scale monitoring with forage perception.

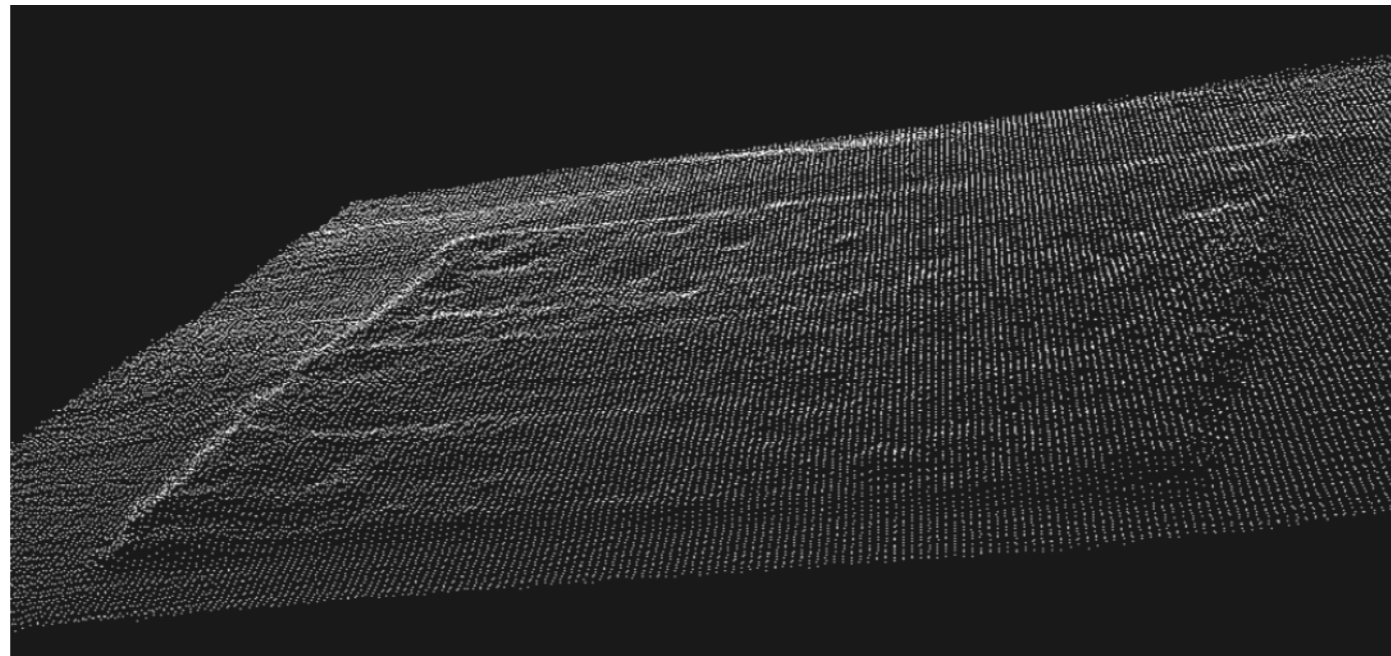
- ▶ How do we choose **when** to deploy a multi-robot team?
  - ▶ Necessitated by large-scale, slowly-evolving process of interest (forage).
- ▶ What is the **influence** of our grassland management decisions on future monitoring?
- ▶ We have proposed a coupled combinatorial optimization approach.

(a) At time  $t = 0$ ,  $a_0 = 1$ .(b) At time  $t = 1$ ,  $a_1 = 4$ .(c) At time  $t = 5$ .

[Intermittent deployment problem]

# How to observe processes on large scales?

- ▶ Deploy robotic **teams** to measure forage quality (Co-PI Pratap Tokekar).



[Forage perception]

	Growth from Week 1 - 2	Growth from Week 2 - 3	Growth from Week 3 - 4
50th Percentile (%)	100.04	119.76	-65.11
75th Percentile (%)	70.12	84.80	-28.37
90th Percentile (%)	40.72	38.35	-19.72
95th Percentile (%)	20.32	37.95	-32.62
97.5th Percentile (%)	7.04	29.79	-20.13
<b>99th Percentile (%)</b>	<b>3.10</b>	<b>12.99</b>	<b>-7.65</b>
99.5th Percentile (%)	11.10	16.18	-3.97

[Forage estimation]

# What are future directions?

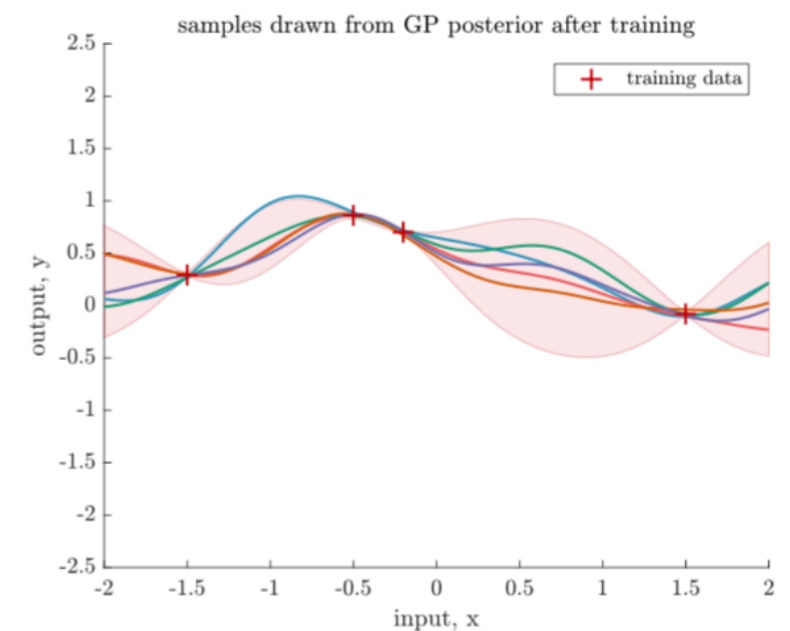
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Input from 'expert' models and evaluating the ecological impact of our autonomy.



# How to reconcile expert models with autonomy?

- ▶ Robotic perception is high resolution on large **spatial** scale.
- ▶ Models for forage systems predict **temporal** behavior with complex inputs:
  - ▶ GRASIM
  - ▶ SPUR
  - ▶ DAFOSYM
  - ▶ ALMANAC
  - ▶ PHYGROW
- ▶ How to exploit the ‘big data’ generated by robots while complementing expert models?
  - ▶ For our problem, we believe the solution is a spatial and temporal decoupling.



[Gaussian process]

SGRASIM Main Input Page			
Modify Tree variables			
Modify Soil variables			
Modify Nutrient variables			
Modify Initialization variables			
Modify Management variables			
RUN SGRASIM			

Modify Crop Variables			
Growth parameters	Orchardgrass	Tall fescue	Alfalfa
Specific Leaf Area	40	40	39
Light Extinction Coefficient	0.5	0.5	0.8
Leaf Transmission Coefficient	0.12	0.12	0.12
Leaf Photosynthetic Efficiency	1.2E-08	1.2E-08	1.0E-08
Light-saturated Leaf Photosynthetic Rate Constant	0.000005	0.000005	0.000005
Light-saturated Leaf Photosynthetic Rate Coefficient	0.0000005	0.0000005	0.0000005
Maximum Specific Growth Rate at 20C	0.4	0.4	0.4
Recycling Constant at 20 degC	0.1	0.1	0.08
Senescence Constant at 20 degC	0.004	0.004	0.04
Photosynthesis Fraction Partitioned to Shoot	0.95	0.95	0.8
Leaf fraction of biomass	0.5	0.5	0.5
Rooting Depth (cm)	70	70	100
Albedo of Vegetation	0.23	0.23	0.23

[GRASIM]



# Think more broadly about what we optimize.

- ▶ Ecological intensification of agricultural systems is one of the great challenges of the 21st century.
- ▶ With a population projected to exceed 9 billion by the middle of this century, business as usual in food production will continue to be a leading cause of biodiversity loss and global pollution.
- ▶ These needs are well-known, but **the influence of autonomy is unclear.**
- ▶ For our project, we propose to develop models and algorithms to support ecologically intensified grazing systems that **optimize cattle productivity and pollinator conservation.**
  - ▶ Led by Co-PIs Megan O'Rourke and Ben Tracy.

THANK YOU FOR YOUR  
TIME.

QUESTIONS?

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