

# Application of Falsification Methods on the UxAS System

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# Summer Of Innovation 2017

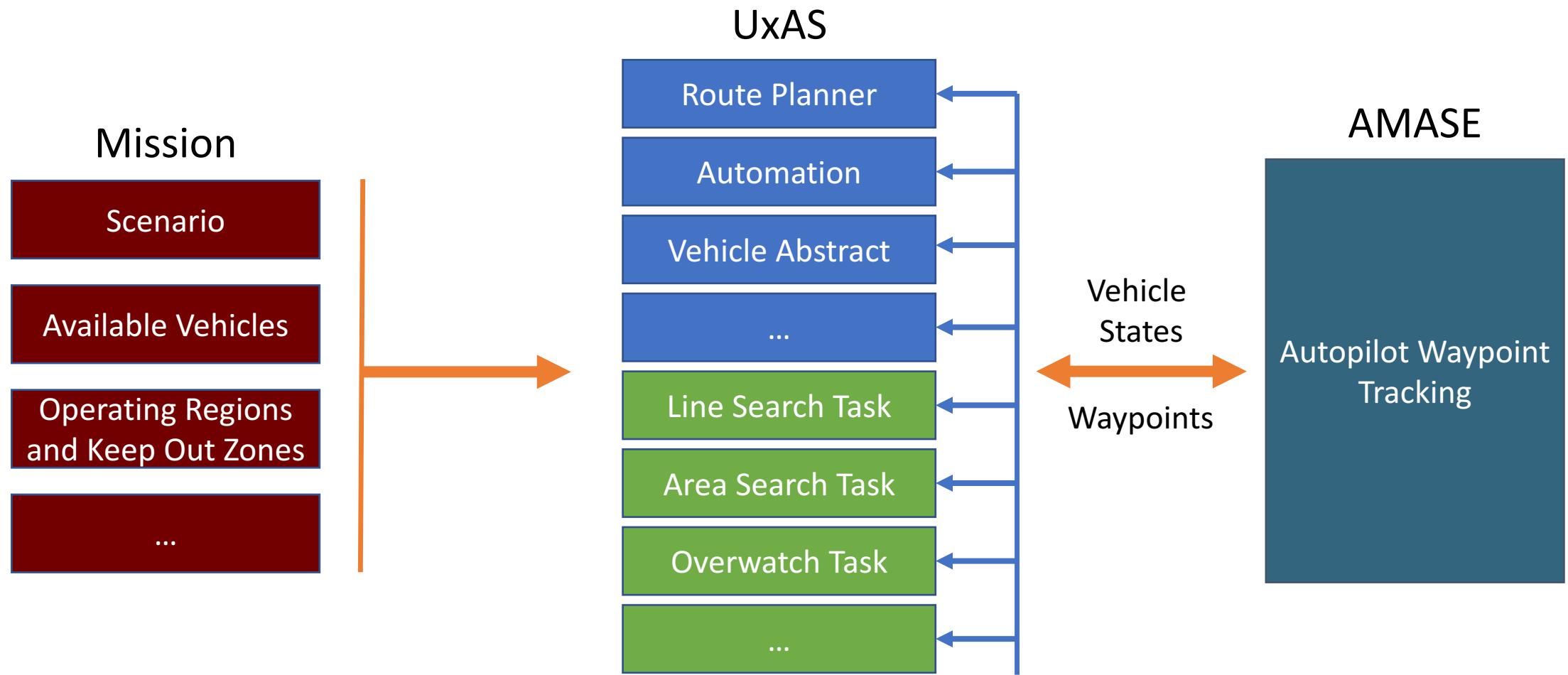


Participants from the industry, academia, and the government  
Apply formal methods to the AFRLs UAV mission planning software UxAS

Requirement formalization • Formal architecture description • Methods for proving correct and safe behavior • Cyber-security considerations • Real-time scheduling/enforcement • Automated test generation • Argumentation and assurance cases • Run-time assurance • Hybrid systems analysis • Improvements in mission and task planning

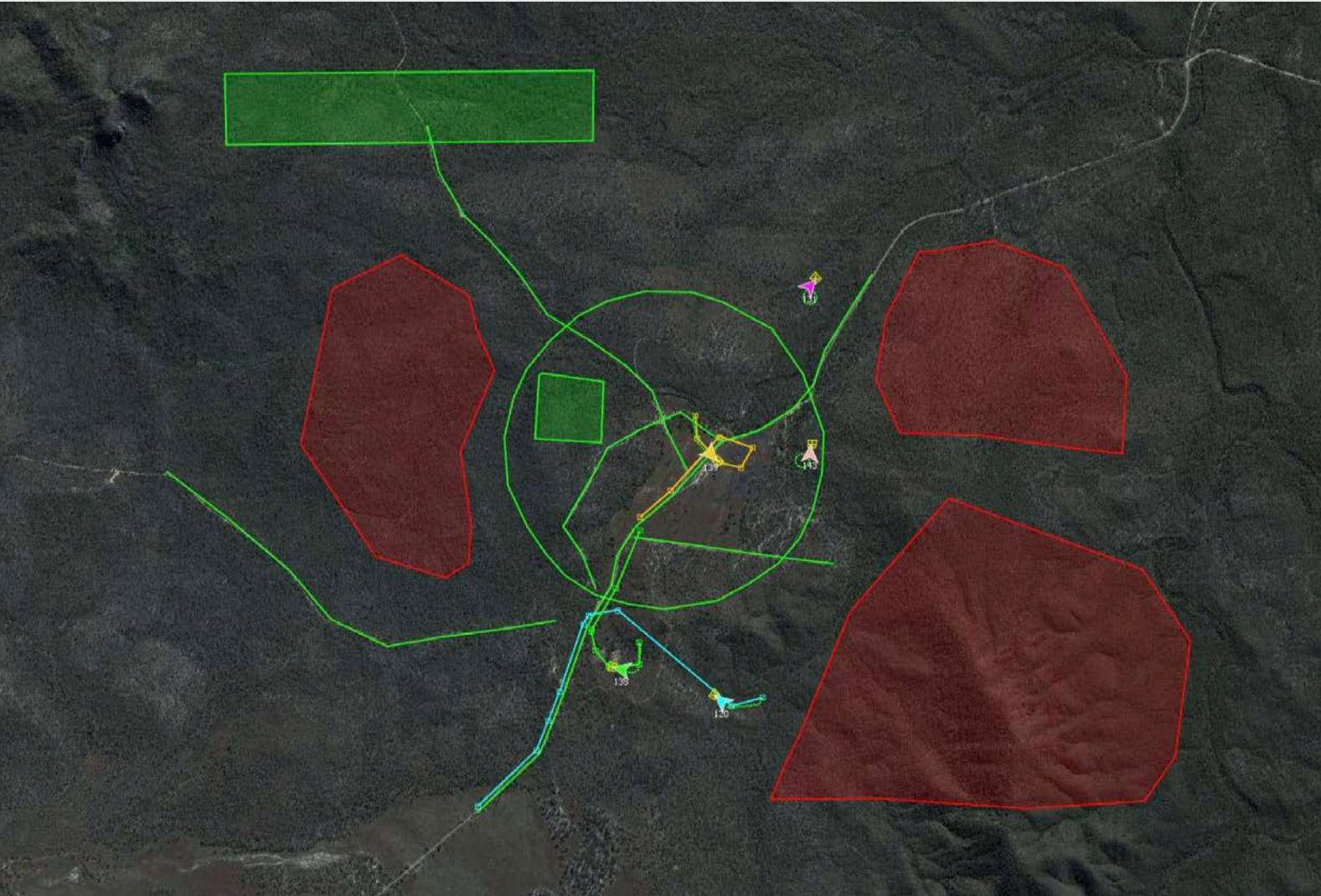
# 1. UxAS and AMASE

# From Mission Scenarios to Simulation



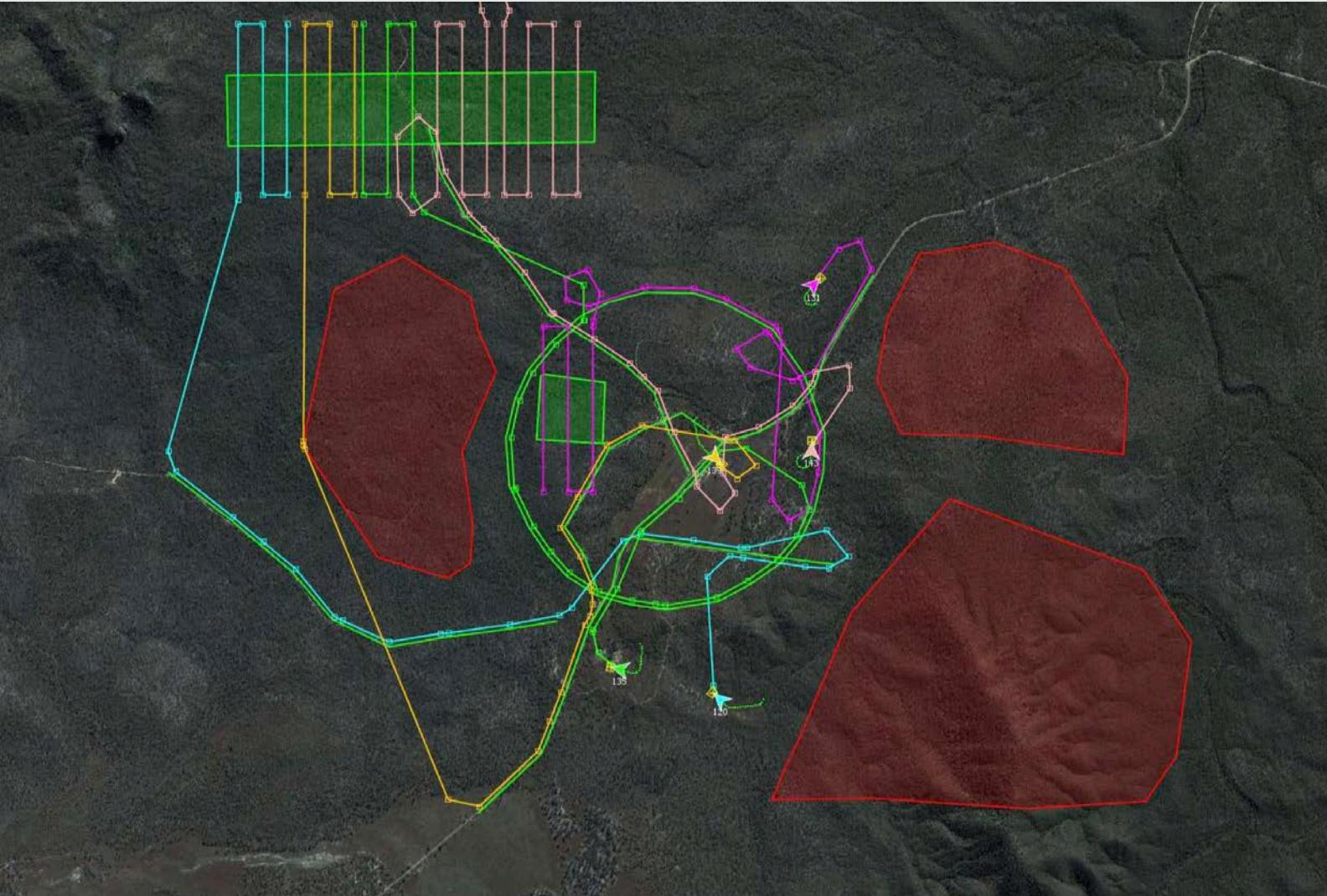
<https://github.com/cmcghan/OpenUxAS>  
<https://github.com/cmcghan/OpenAMASE>

# Tasks



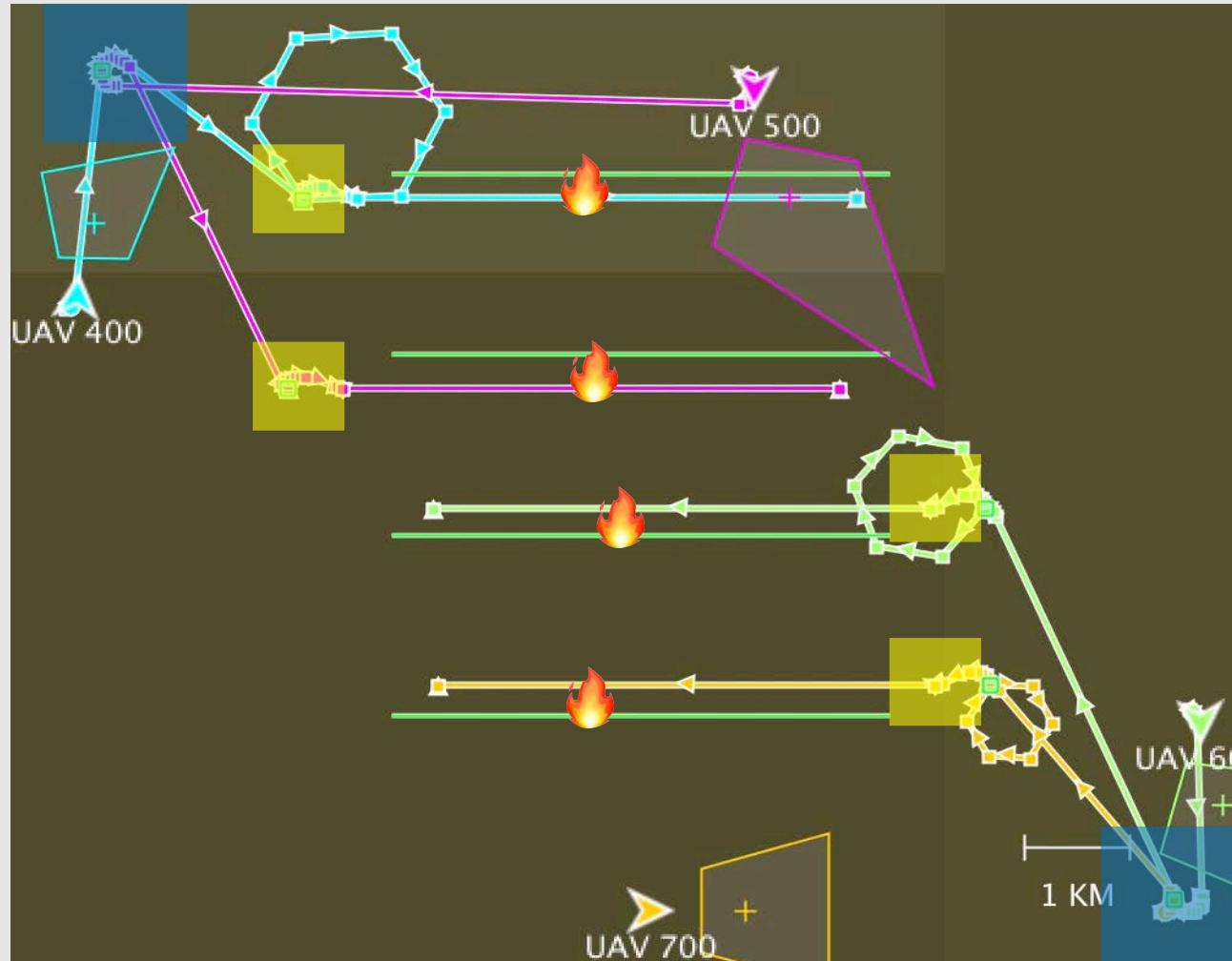
[Slide adopted/modified from D. Fisher, S5 2017]

# Assignment



[Slide adopted/modified from D. Fisher, S5 2017]

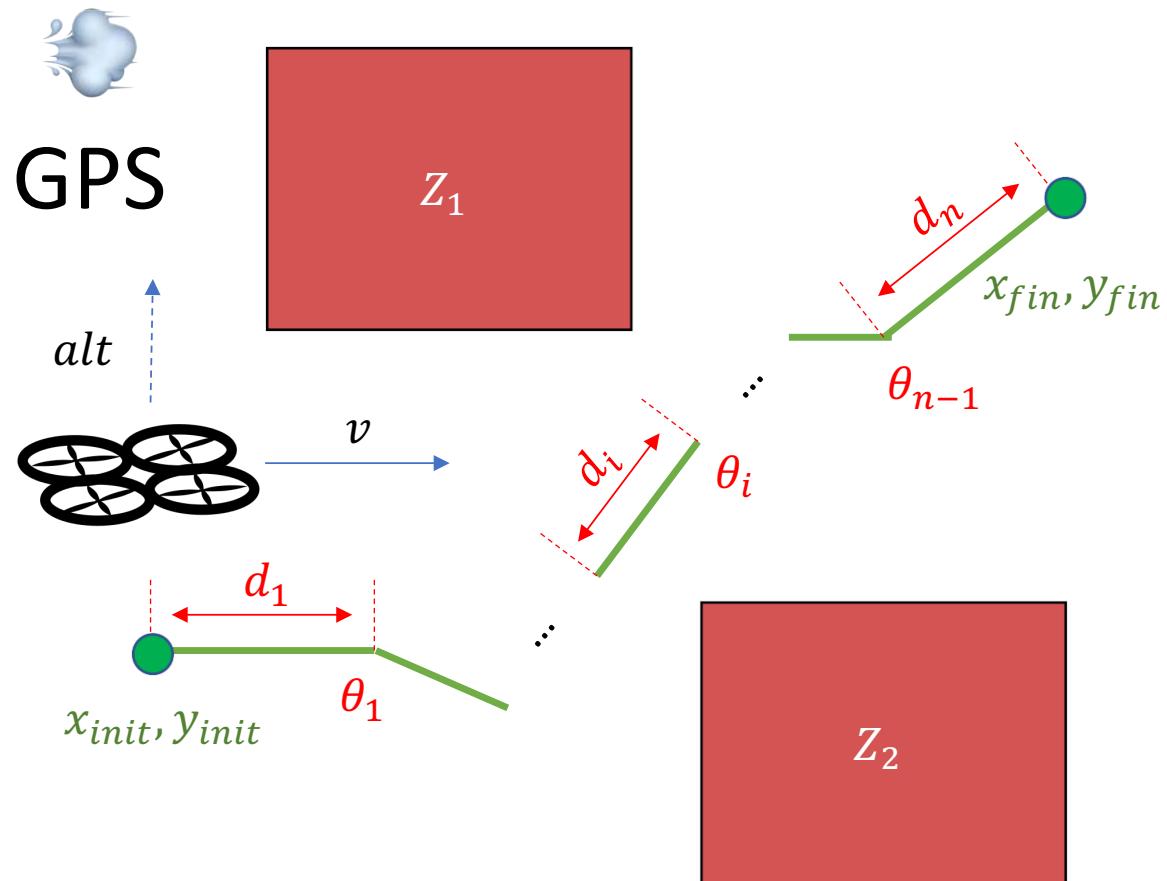
# Synchronized Firefight



<https://youtu.be/rgerTBylMsc>

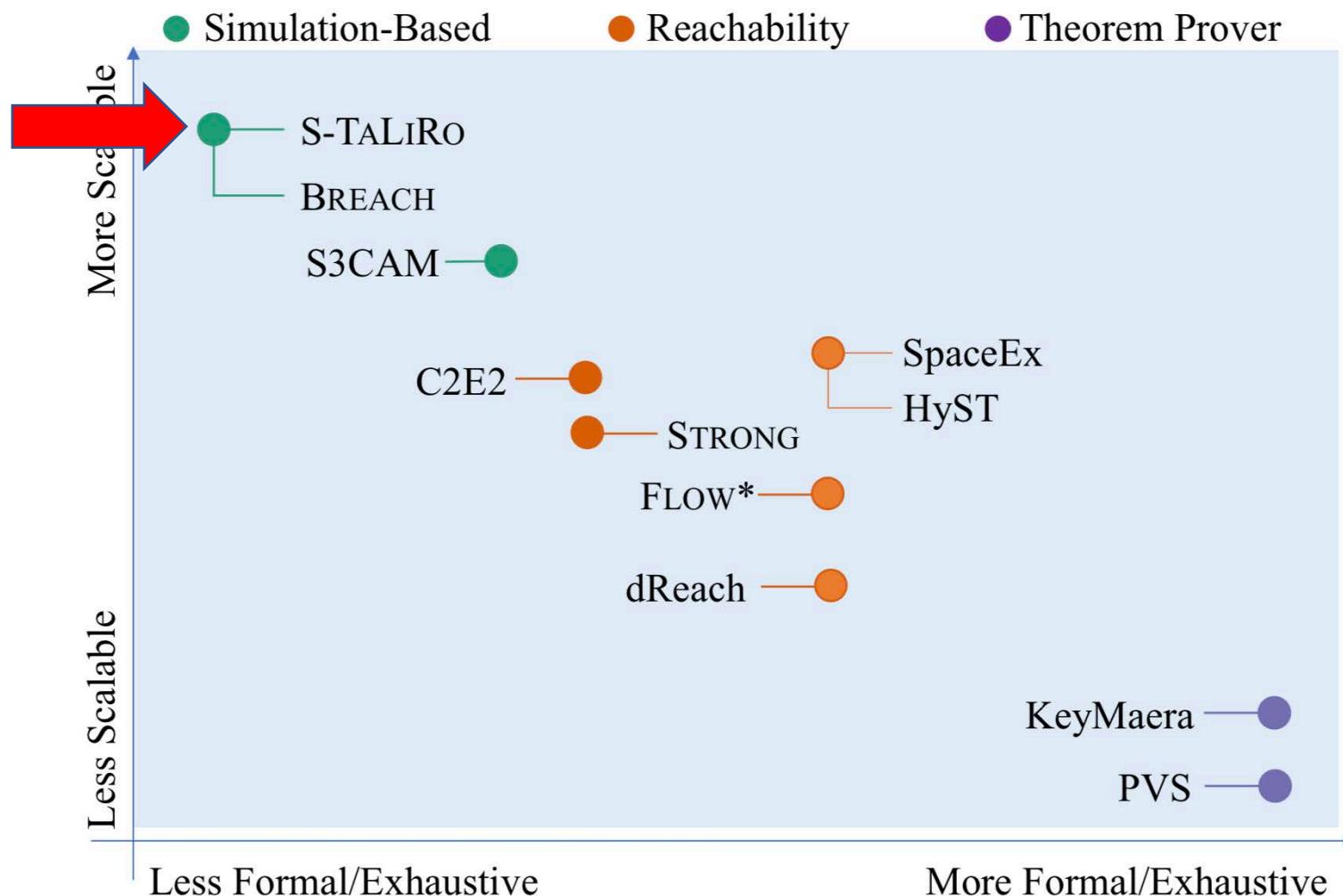
[ASU – SIU – VU] [ADHS2018]

# Testing UxAS: Keep Out Zone Violations

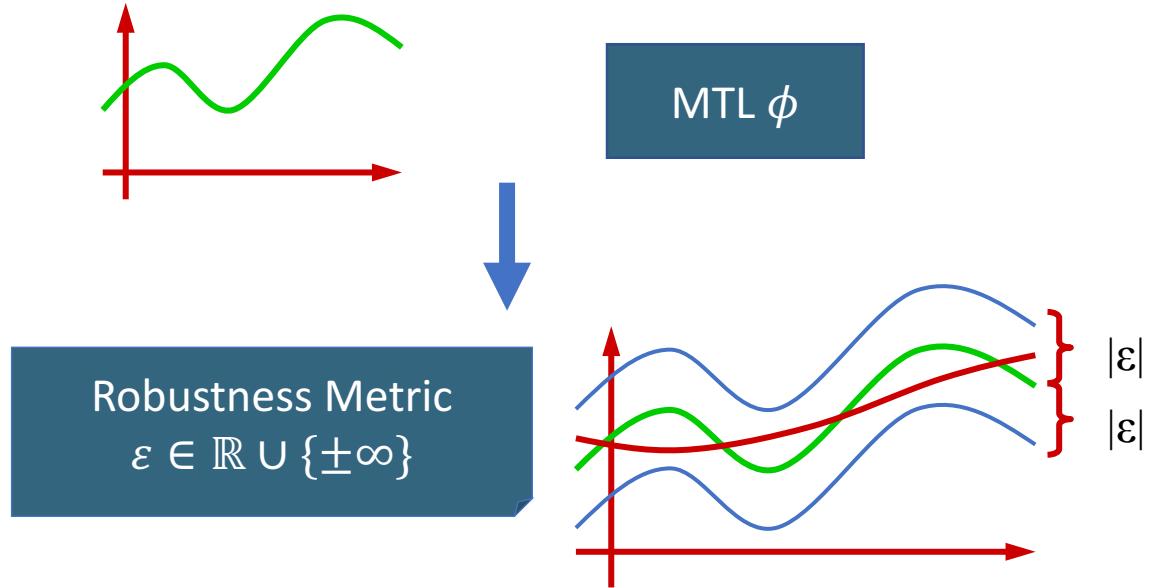


## 2. Robustness-Guided Testing

# Methods and Tools



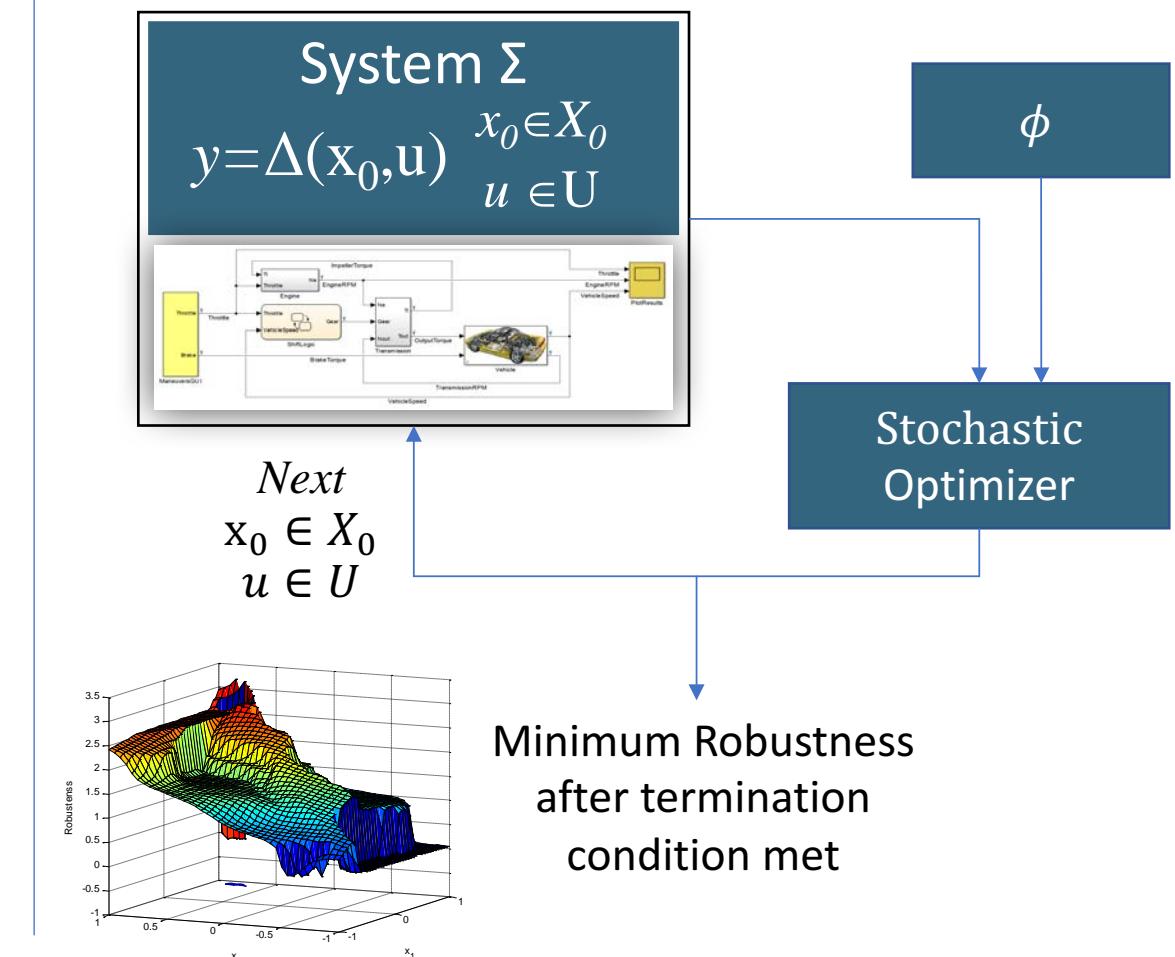
# Falsification By Optimization



positive robustness  $\rightarrow$  signal satisfies the formula

negative robustness  $\rightarrow$  signal falsifies the formula

[Fainekos and Pappas, TCS]



[Abbas et al. TECS]

## Metric Temporal Logic

- Propositional logic + Temporal Operators with timing intervals
- Interpreted over traces/trajectories
  - Ex.  $G_{[0,5]}p \wedge F_{[2,4]}b$  :  
“*always* from 0 to 5, p is true and  
*eventually* from 2 to 4, b is true”

## Model

Simulink/Stateflow  
User-defined functions

S-TALIRO

## Stochastic Optimization Engine

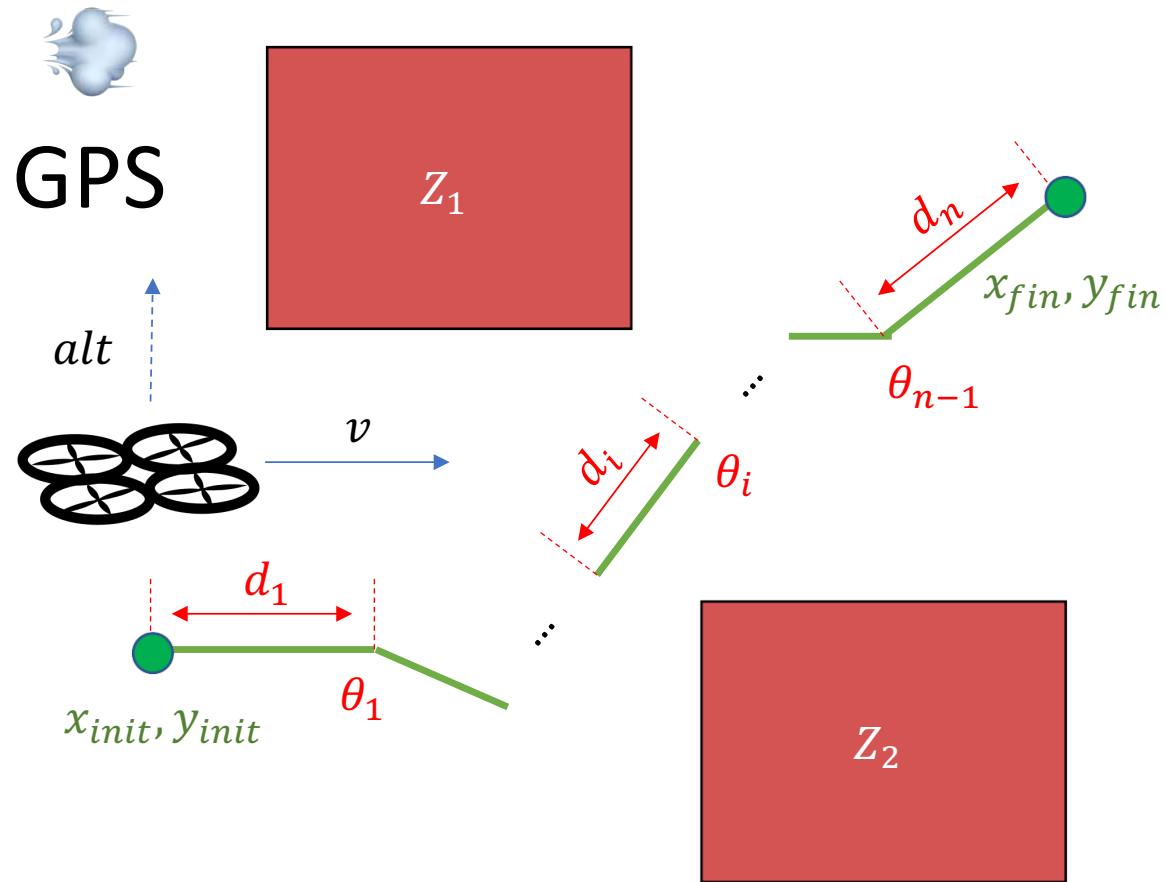
- Simulated Annealing
- Cross Entropy
- Ant-colony
- Gradient Descent
- Flexible initial condition and input signal generation

## Features

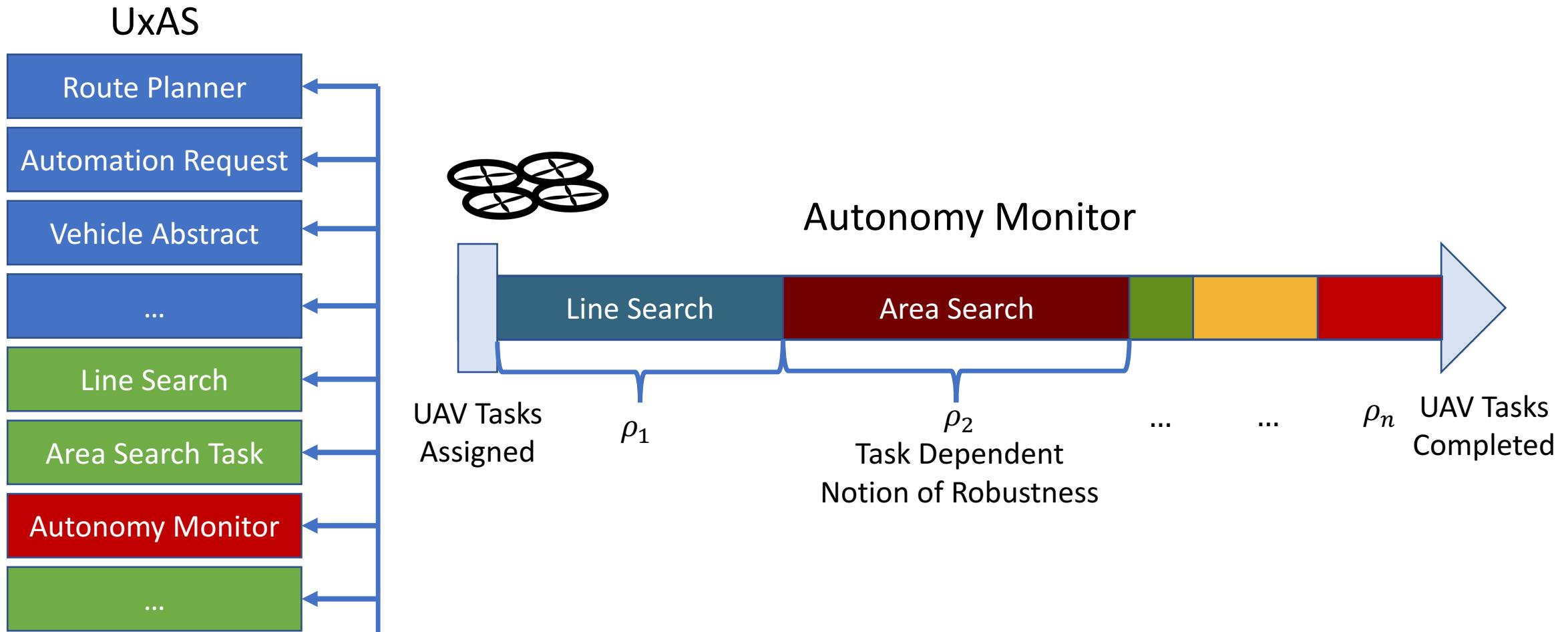
- Falsification
- Parameter Mining
- Requirement Engineering with ViSpec
- Runtime Verification
- Conformance Testing
- ...

### 3. Testing UxAS

# Keep Out Zones



# Autonomy Monitors



# Testing UxAS with S-TaLiRo

Keep Out Zones:

$$\phi_Z = \bigwedge_{i=1}^n G(r_i \rightarrow F_{[0,10]} \neg r_i)$$

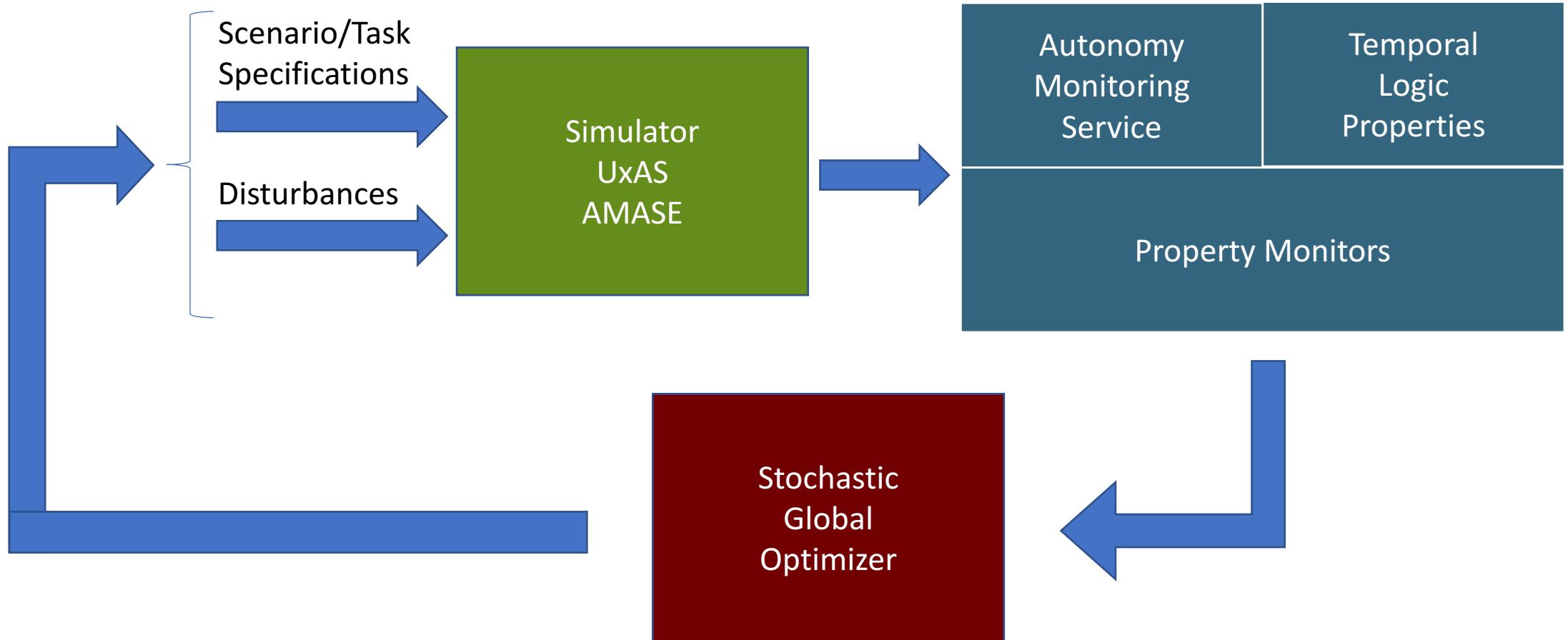
Autonomy Monitors:

$$\phi_M = \bigwedge_{i=1}^k M_k$$

Specification  $\phi$ :

$$\phi = \phi_Z \wedge \phi_M$$

# Stochastic Optimization



# Result: Falsification



# Future Work

## 1. Parameter Mining of MTL Specs [Hoxha et al. STTT]

$$\phi_Z = \bigwedge_{i=1}^n G(r_i \rightarrow F_{[0,\theta]} \neg r_i)$$

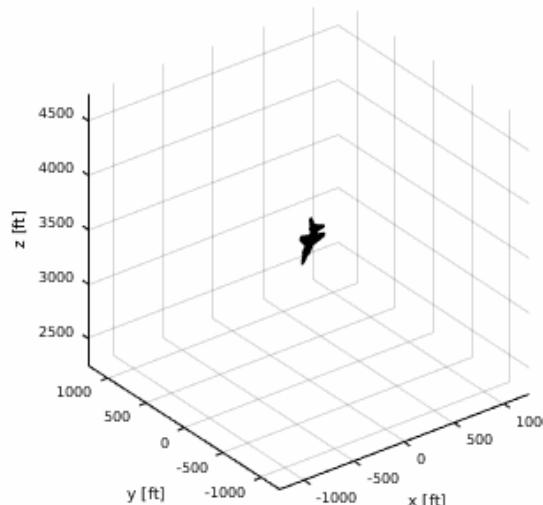
What is the value of  $\theta$ ?

t = 0.00 sec Waiting  
h = 3500.00 ft V = 540.00 ft/s  
 $\alpha$  = 2.12 deg  $\beta$  = 0.00 deg  
 $N_z$  = 0.17 g  $P_s$  = 0.00 deg/s  
[ $\phi$   $\theta$   $\psi$ ] = [-45.0, -72.0, -45.0] deg

## 2. More complex vehicle dynamics

Ex: F16 Aircraft Model

[Bak and Heidlauf]



[github.com/pheidlauf/AeroBenchVV](https://github.com/pheidlauf/AeroBenchVV)

# Acknowledgments



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# Thank You Questions?

MTL Survey

Test hypothesis that formal methods experts can write correct MTL specifications from NL

[www.bit.ly/2HKsMQK](http://www.bit.ly/2HKsMQK)