

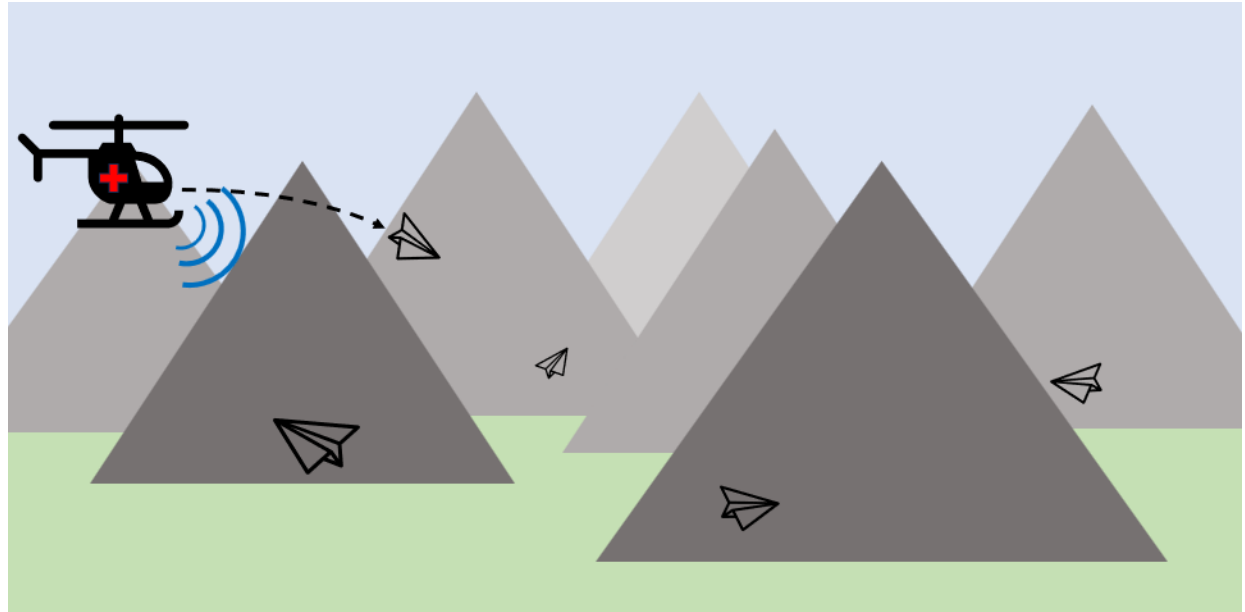
# Autonomous Control of Air-Launched Fixed-Wing Drone Swarm

Culminating Experience Project in the Pursuit of Mechanical Engineering Master's Degree

Alex Springer, June 2021 - May 2024

# Project Definition and Overview

- Air-Launched Drone Swarms
- Independent Non-Linear Agent Control System
- User-Specified Commands:
  - Fly-Over Waypoints
  - Drone trajectories
- Agents Tracked by C2 Aircraft
- Agents Autonomously Assigned to User Commands



Use-Case: Search and Rescue in Mountainous Terrain

# Control System Hierarchy

## Agent States Continuously Estimated

- Each Agent Tracked by Command & Control Aircraft
- Agent Position, Velocity, and Acceleration Estimated by Random Finite-Set Based Filter

## User Input

- User Input of Fly-Over Waypoint (applications: search & rescue, surveillance, package drop)
- Latitude, Longitude, Altitude, Groundspeed

## Agent-Waypoint Assignment

- Cost Estimated for Each Agent: Distance, Altitude, Heading, and Groundspeed all considered
- Linear Hungarian Assignment Algorithm Used to Assign Agents and Minimize Overall Cost

## Individual Agent Controller

- Non-Linear Navigation Controller to Command Airspeed, Heading, and Rate of Climb
- Proportional Controller Converts Waypoint Assignments to Controller Inputs At Each Time Step

# Fixed-Wing Aircraft Non-Linear Guidance System (FANGS)

Individual Agent Flight Controller

# The Underlying Controller for Each UAS Agent

- Based on Nonlinear Aircraft-Performance Simulation by Dr. John Schierman in his Modern Flight Dynamics textbook
- Rigid fixed-wing aircraft operating in steady wind
- Uses a default state estimator with ideal equations of motion
  - User can provide a state solution at any time step; any unprovided state variables are estimated using the default ideal estimator
- Input: desired flight profile
  - Velocity, rate of climb, and heading

# Simulation Setup

- Drones initially modelled loosely from a C-130 fixed-wing aircraft
  - Long flight-time and/or range
  - Heavy payload (cameras, telemetry, first-aid package drop, etc.)
  - Modified for quicker/more responsive flight dynamics
- Each drone launched from a C2 helicopter
- Flight controller in operation 150 feet after launch
  - Assume wings deploy during first 150 feet
  - After 150 feet, assumed 50 kts airspeed with no ascent or descent
- 8 drones launched ~5 seconds apart

# Ideal EOM: Governing Equations

Translational equations of motion for a vehicle with propulsive thrust aligned with the fuselage x-axis:

$$m\dot{V}_V = T\cos(\alpha)\cos(\beta) - D - mg\sin(\gamma)$$

$$mV_V(\dot{\psi}_W \cos(\phi_W) \cos(\gamma) - \dot{\gamma} \sin(\phi_W)) \\ = S + T\cos(\alpha) \sin(\beta) + mg\sin(\phi_W) \cos(\gamma)$$

$$mV_V(\dot{\gamma} \cos(\phi_W) + \dot{\psi}_W \sin(\phi_W) \cos(\gamma)) \\ = L + T\sin(\alpha) - mg\cos(\phi_W) \cos(\gamma)$$

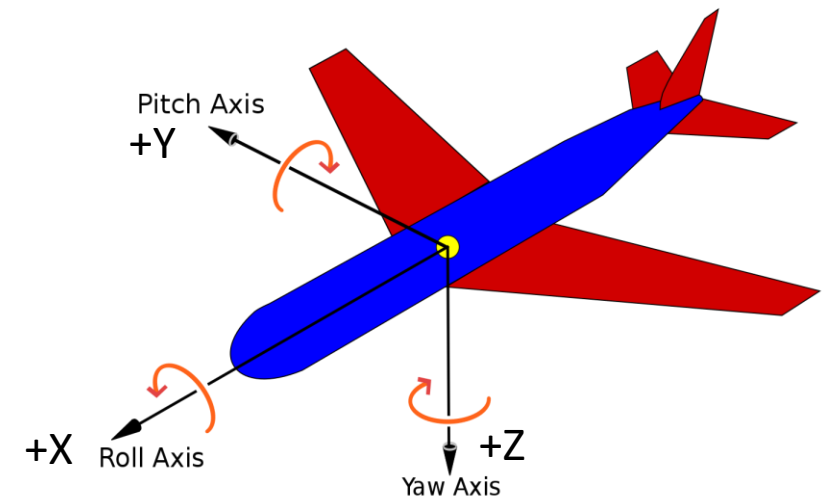


Image from: By Yaw\_Axis.svg: Auawisederivative work: Jrvz (talk) - Yaw\_Axis.svg, CC BY-SA 3.0, <https://commons.wikimedia.org/w/index.php?curid=9441238>

Reference: Modern Flight Dynamics by Dr. John Schierman

# Ideal EOM: Definitions

$\gamma$  – Flight-Path angle

$\phi_W$  - Wind-Axes bank angle

$\psi_W$  - Heading angle (CCW from North)

$V_V$  - Inertial velocity

$\beta$  – Side-Slip angle

$S$  – Aerodynamic side force

$\alpha$  – Angle of attack

$T$  – Thrust

$D$  – Drag

$L$  – Lift

$\dot{h}$  - Rate of climb

$W$  – Weight (also  $mg$ )

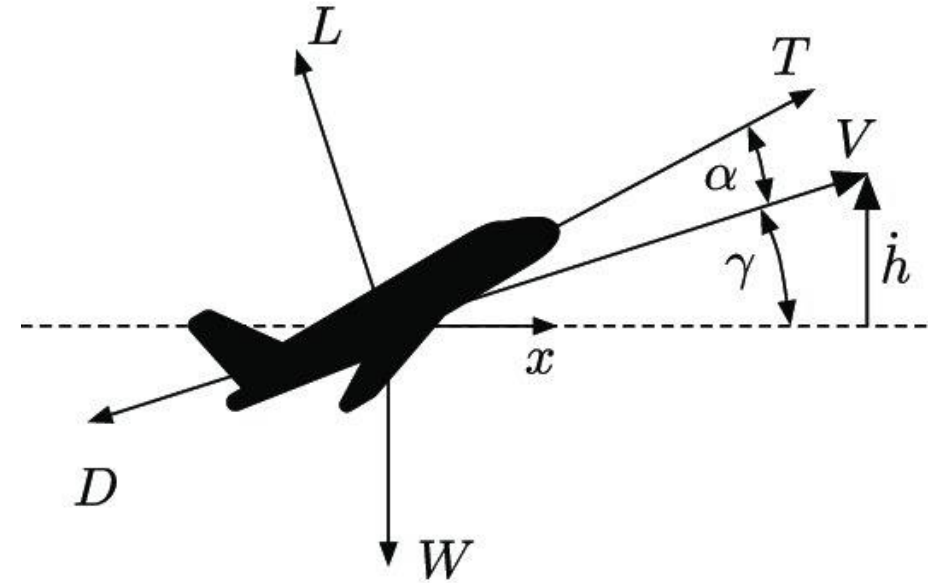


Image from: Large-Scale Path-Dependent Optimization of Supersonic Aircraft (researchgate.net)



# Ideal EOM: Simplifying Assumptions

- Steady level flight or coordinated turns (sideslip  $\beta$  and side force  $S$  are zero)
- Assume sufficiently small angles of attack such that
  - $T \cos(\alpha) \approx T$
  - $T \sin(\alpha) \ll L$
- The governing equations become

$$\begin{aligned}\dot{V}_V &= \frac{T - D}{m} - g \sin(\gamma) \\ \dot{\gamma} &= \frac{1}{m V_V} (L \cos(\phi_W) - m g \cos(\gamma)) \\ \dot{\psi}_W &= \frac{L \sin(\phi_W)}{m V_V \cos(\gamma)}\end{aligned}$$

Reference: Modern Flight Dynamics by Dr. John Schierman

# Ideal EOM: Engine and Airframe Responses

- First-Order Differential Equations Used to Approximate the Engine and Airframe Responses

$$\begin{aligned}\dot{T} &= -p_T T + p_T T_c \\ \dot{L} &= -p_L L + p_L L_c \\ \dot{\phi}_W &= -p_\phi \phi_W + P_\phi \phi_C\end{aligned}$$

- Limits imposed on the responses

$$0 \leq T \leq T_{max}, L \leq K_{L_{max}}, |\phi_W| \leq \phi_{W_{max}}$$

- **1/time constants  $p_T, p_L, p_\phi$  set to  $2.0 \text{ s}^{-1}$ ,  $0.5 \text{ s}^{-1}$ , and  $1.0 \text{ s}^{-1}$ , respectively, in simulation**

Reference: Modern Flight Dynamics by Dr. John Schierman

# Ideal EOM: Aerodynamic Responses

- The model used in the ideal equations of motion for aerodynamic lift and drag

$$C_L = C_{L_\alpha}(\alpha - \alpha_0)$$
$$C_D = C_{D_0} + \frac{C_L^2}{K_D}$$

where  $L = C_L q_\infty S_w$ ,  $D = C_D q_\infty S_w$ ,  $q_\infty = \frac{1}{2} \rho_\infty V_\infty^2$ , and  $K_D = \pi A e_{eff}$

Note: FANGS is designed to operate within the presence of wind, where  $V_\infty \neq V_V$

Reference: Modern Flight Dynamics by Dr. John Schierman

# Ideal EOM: Angle of Attack and Drag

- Invert the prior equations to find the inferred Angle of Attack and Drag given a Lift command

$$D = K_{D_0} V_\infty^2 + K_{D_I} \left( \frac{L^2}{V_\infty^2} \right)$$

$$\alpha = K_L \left( \frac{L}{V_\infty^2} \right) + \alpha_0$$

$$\text{where } K_{D_0} = \frac{1}{2} \rho_\infty S_w C_{D_0}, K_{D_I} = \frac{2}{\rho_\infty S_w K_D}, \text{ and } K_L = \frac{2}{\rho_\infty S_w C_{L_\infty}}$$

Reference: Modern Flight Dynamics by Dr. John Schierman

# Guidance Laws – Transfer Functions

- Inputs: Commanded **Velocity**  $V_c$ , **Rate of Climb**  $\dot{h}_c$ , and **Heading**  $\psi_c$
- Outputs: Commanded **Thrust**  $T_c$ , **Lift**  $L_c$ , and **Bank Angle**  $\phi_{W_c}$

$$\frac{T_c(s)}{V_E(s)} = \frac{mK_{TP}(s + K_{TI}/K_{TP})}{s}$$
$$\frac{L_c(s)}{\dot{h}_E(s)} = \frac{mK_{LP}(s + K_{LI}/K_{LP})}{s}$$
$$\frac{\phi_{W_c}}{\psi_E} = K_{\phi_P} \left( \frac{V_c}{g} \right)$$

Reference: Modern Flight Dynamics by Dr. John Schierman

# Guidance Laws - ODEs

- Convert the transfer functions to ODEs to be programmed in Python 3 and solved using `scipy.integrate.solve_ivp` with the RK45 method:

$$\begin{aligned}\dot{x}_T &= m\dot{V}_E \\ T_C &= K_{T_I}x_T + K_{T_P}mV_E \\ \dot{x}_L &= m\dot{h}_E \\ L_C &= K_{L_I}x_L + K_{L_P}m\dot{h}_E \\ \phi_{W_C} &= K_{\phi_P}(V_C/g)\psi_E\end{aligned}$$

where  $V_E \triangleq V_C - V_V$ ,  $\dot{h}_E \triangleq V_C(\sin \gamma_C - \sin \gamma)$ , and  $\psi_E \triangleq \psi_C - \psi_w$

Reference: Modern Flight Dynamics by Dr. John Schierman

# Implementation (Python 3)

- FANGS.py
  - Create an object of class GuidanceSystem
    - Initialization inputs:
      - vehicle: Object of type FixedWingVehicle
      - TF\_constants: Dictionary of PI Controller transfer function coefficients ( $K_{TP}, K_{TI}, K_{LP}, K_{LI}, K_{\phi_P}$ )
      - InitialConditions: Dictionary of initial conditions
    - User-Accessible Functions:
      - setCommandTrajectory()
      - setFlyoverCommand()
      - getGuidanceCommands()
      - updateSystemState()

# Implementation (Python 3), continued

- After initialization, the drone is commanded to fly at initial conditions.
- The user may give any drone a command of either:
  - Trajectory
    - The user will supply a desired airspeed, heading, and rate of climb.
  - Flyover
    - The user will supply a desired waypoint, altitude, and groundspeed.
- Alternatively, the user may give the swarm a list of Flyover commands
  - See ATAMS section for more.



# User Commands: Trajectory

- User may request a trajectory command at any time:
  - **Velocity**  $V_c$ , **Rate of Climb**  $\dot{h}_c$ , and **Heading**  $\psi_c$
  - Use `setCommandTrajectory()`
- Guidance Laws calculated when `getGuidanceCommands()` is called
  - Run this each time step
- Use-Case: Loiter, Send-To-Home

# User Commands: Flyover

- The user may request a flyover command at any time:
  - **Groundspeed** (feet/sec), **Altitude** (ft, MSL), **Waypoint** (latitude, longitude)
  - Use setCommandFlyover()
- An internal flag will note that a flyover has been requested
- At each timestep, when getGuidanceCommands() is run, FANGS will internally convert flyover commands to trajectory commands for the aircraft guidance logic
  - Proportional Controller: see next slide

# User Commands: Flyover, continued

## 1. Get to the commanded aircraft altitude

Calculate required glideslope  $\gamma$  to reach commanded altitude using a 1-mile :

if  $abs(\gamma) > 15^\circ$ :

$$\gamma_c = sign(\gamma) * 15^\circ$$

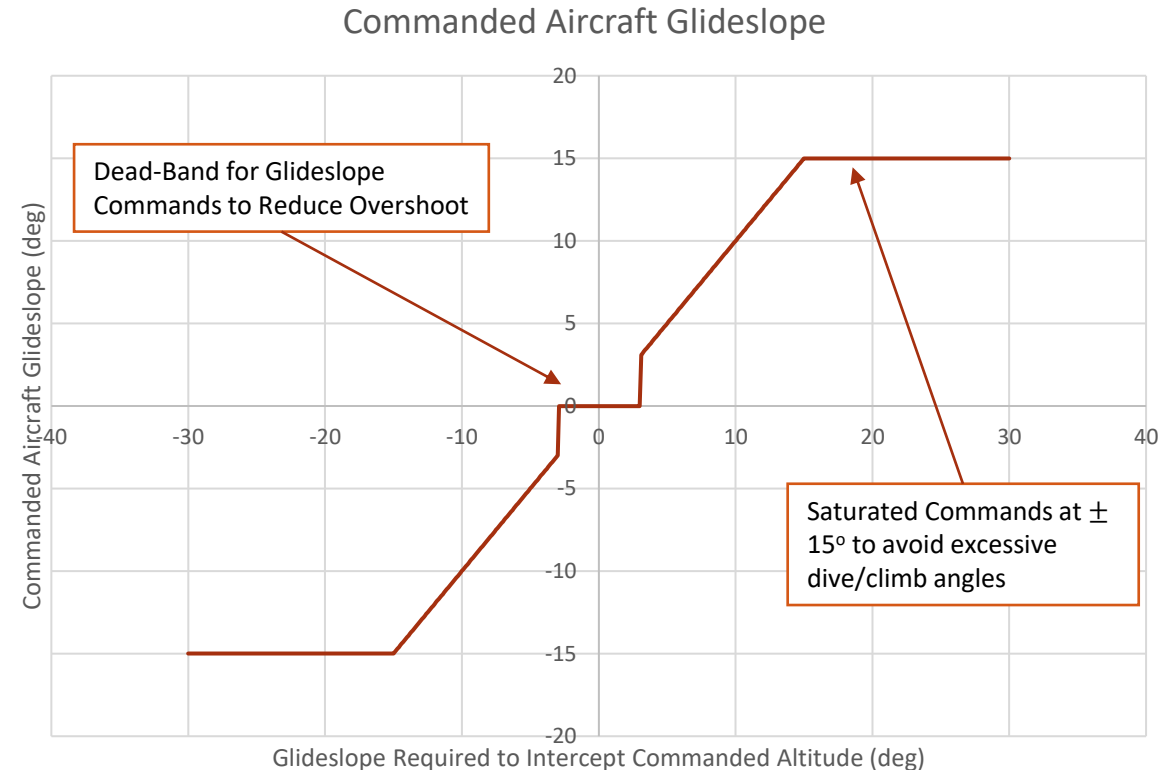
elseif  $abs(\gamma) < 3^\circ$ :

$$\gamma_c = 0$$

else:

$$\gamma_c = \gamma + sign(\gamma) * K_\alpha * \gamma$$

It will then send the commanded  $\gamma_c$  to the trajectory controller logic



# User Commands: Flyover, continued

2. While altitude is stabilizing, fly as fast as possible until within 2 miles of the flyover point

if distance from target  $> 2$  miles:

velocity = maximum allowable velocity - 15

else:

velocity =  $K_v * (\text{input velocity} - \text{current airspeed}) + \text{current airspeed}$

# User Commands: Flyover, continued

3. While changing velocity and altitude, continually adjust heading to intercept flyover point

heading = bearing between(current latitude/longitude, target latitude/longitude)

4. If the aircraft is within 300 feet of the target, “let go” of the flyover waypoint and switch to a trajectory controller holding the current flight path for intercept.
  - Aircraft will maintain this flight path until the user specifies a new trajectory or flyover command

# Example Simulation – Single Agent

- Initial Conditions
  - Airspeed = 50 knots
  - Altitude = 7000 feet above mean sea level
  - Ascent = 0 degrees
  - Heading = 0 degrees (North)
  - (Latitude, Longitude) = (36.2434, -112.2822) degrees
  - Weight = 80 pounds
  - Wind = 15 knots east

# Example Simulation – Single Agent

- Drone Parameters
  - Max speed = 75 knots
  - Min speed = 25 knots
  - $p_T, p_L, p_\phi = (2.0, 0.5, 1.0)$
  - Max thrust = 45 pounds
  - Max  $K_L = 0.26$
  - Max bank angle = 45 degrees
  - $C_{D_0} = 0.05$
  - $C_{L_\alpha} = 0.5$  radians
  - $\alpha_0 = -0.1$  degrees
  - Wing area = 8 square feet
  - Aspect ratio = 12
  - Wing efficiency factor = 0.8

# Example Simulation – Single Agent

- Controller Transfer Function Gains

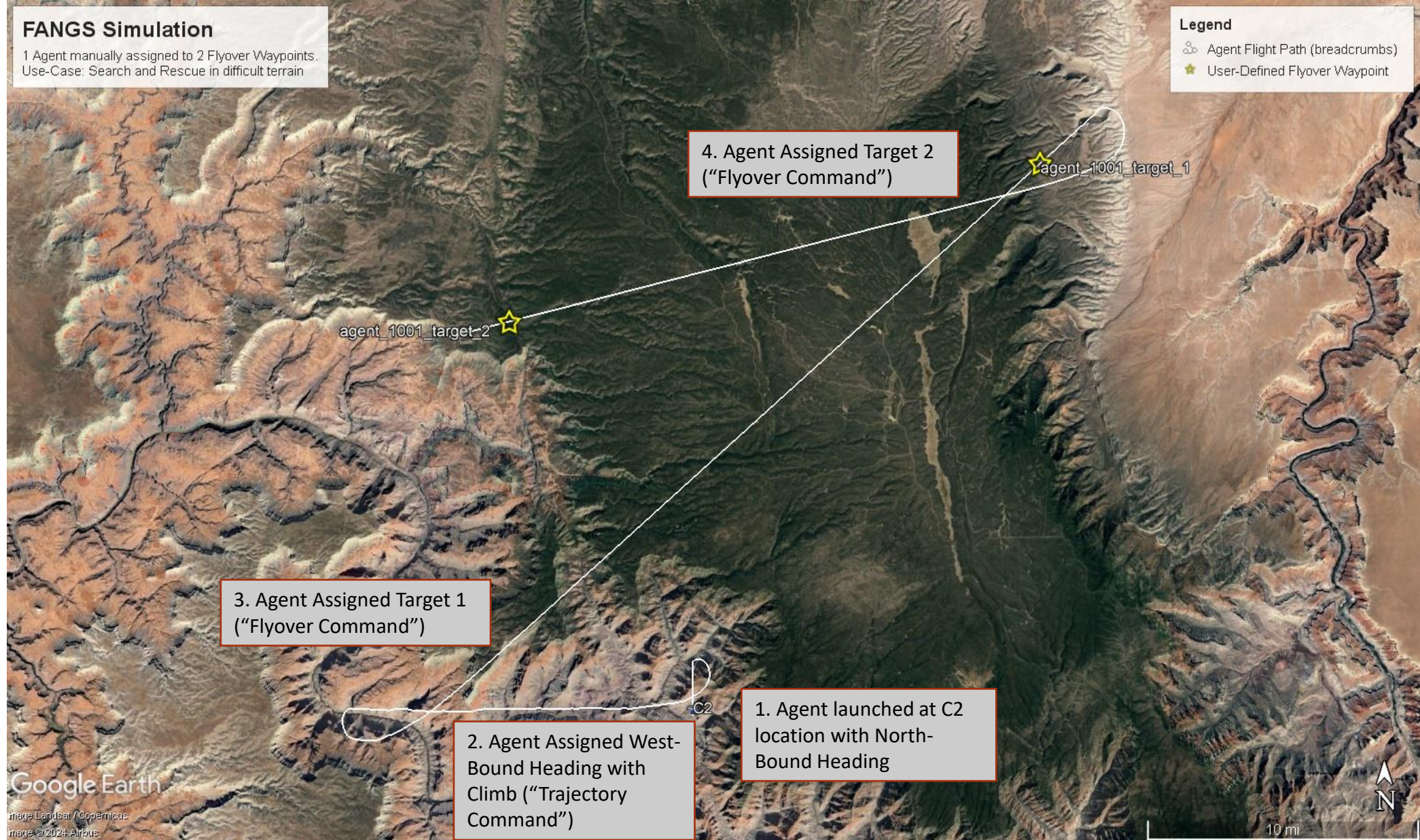
- $K_{T_P} = 0.15$
- $K_{T_i} = 0.05$
- $K_{L_P} = 0.3$
- $K_{L_i} = 0.03$
- $K_{\phi_P} = 0.03$
- $K_{\alpha} = 0.05$
- $K_v = 0.05$



# Example Simulation – Inputs

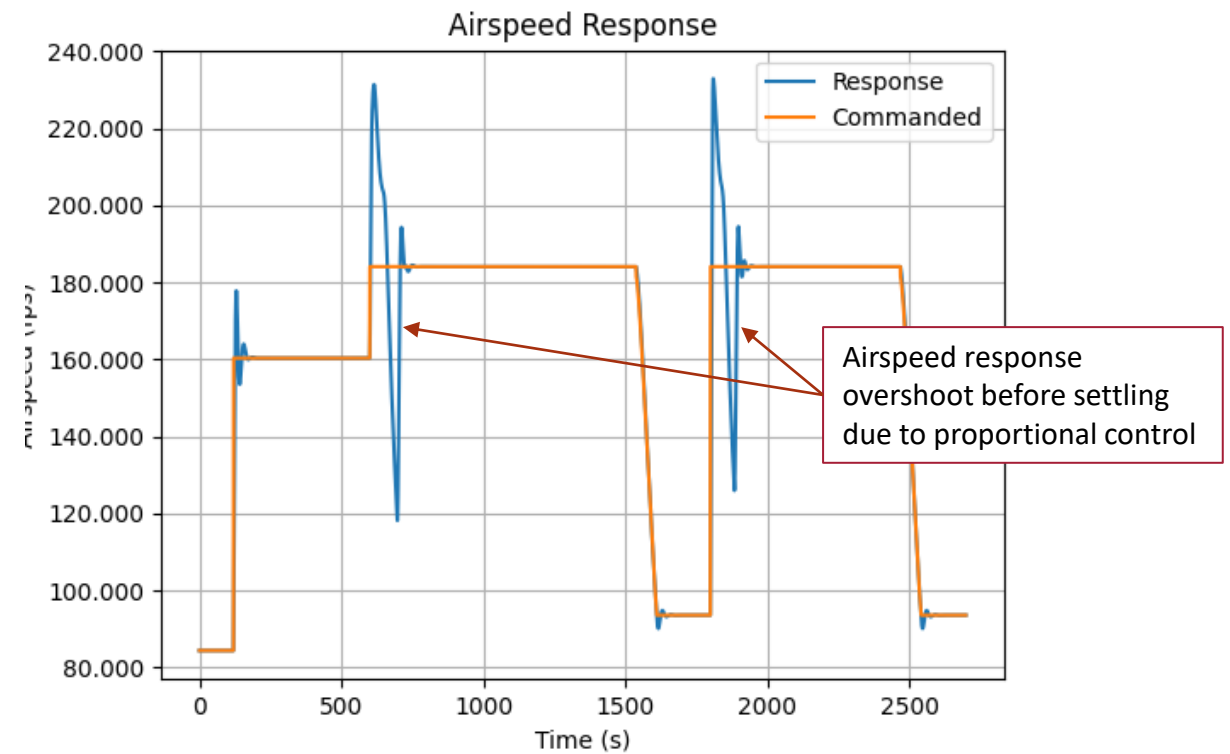
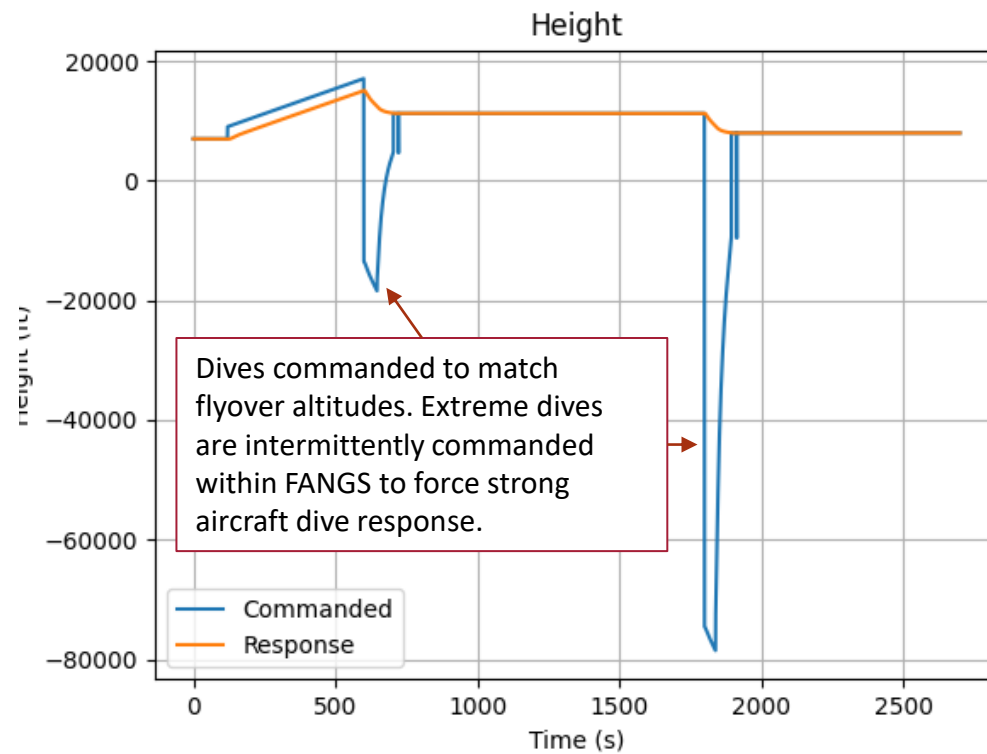
- Initial conditions: 50 knots, level flight, North heading ( $0^\circ$ )
  - 15 knot wind out of the west
- After 120 seconds, command trajectory: 95 knots, 6-degree ascent, West heading ( $270^\circ$ )
- After 600 seconds, command flyover: 50 knots, 11000 feet MSL, (36.530367, -112.057600)
- After 1800 seconds, command flyover: 50 knots, 7700 feet MSL, (36.449291, -112.399009)
- Simulate 45 total minutes of flight time

# Results



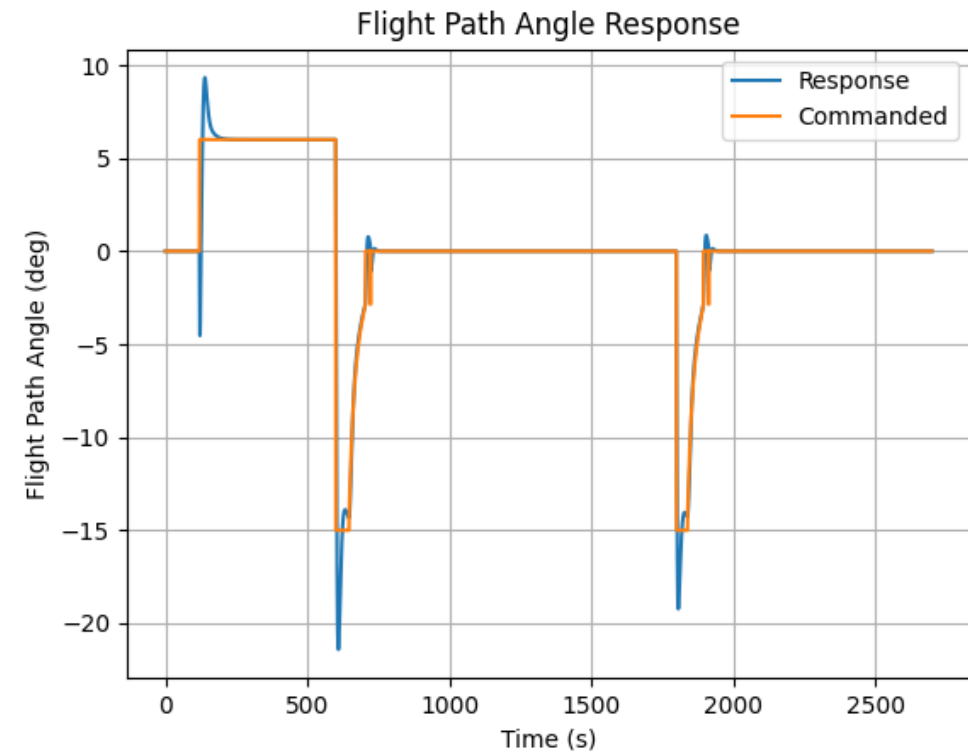
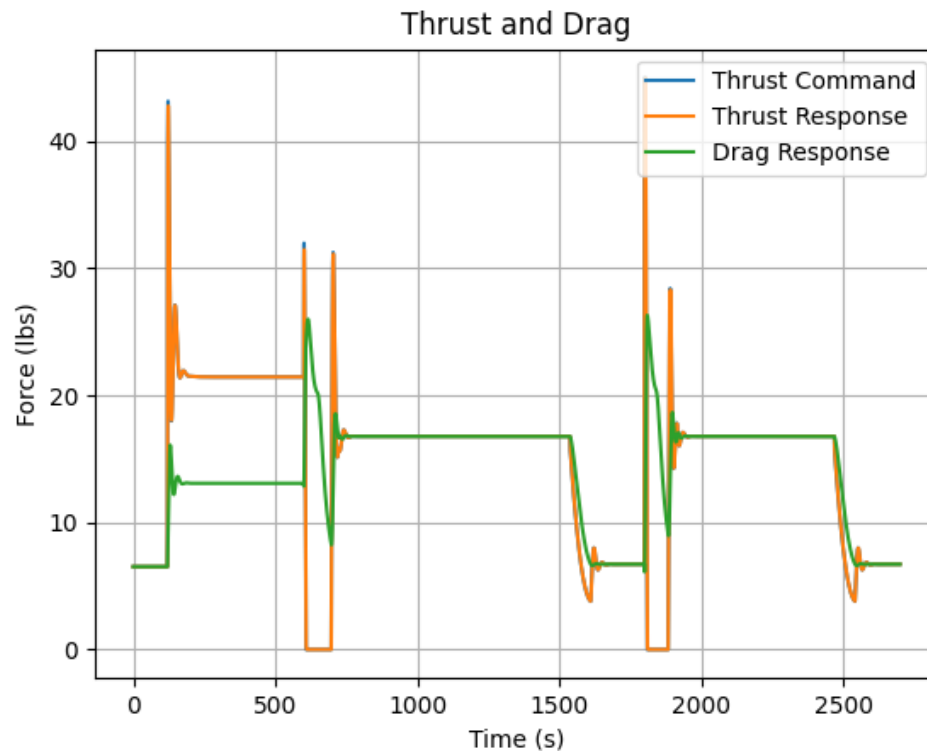


# Example Simulation Results, Altitude and Airspeed



# Example Simulation

## Results, Thrust, Drag, and Flight Path Angle



# Agent Tracking and Assignment Management System (ATAMS)

Agent-Waypoint Assignment

# Target Assignments – Cost

- Cost value assigned to each target-agent assignment
  - Each calculation uses a weighting that can be user-defined
    - $W_d$  : Weighting of Distance Cost
    - $W_a$  : Weighting of Altitude Cost
    - $W_v$  : Weighting of Velocity Cost
    - $W_h$  : Weighting of Heading Cost
- Calculate the cost of each possible agent-target assignment
  - Ex: If 8 active agents and 4 assignments, 32 total cost calculations

# Target Assignments – Cost, Continued

- Distance Cost:
  - Simply multiply the distance between the agent and the target by  $W_d$
- Heading Cost:
  - Simply multiply the heading change required to intercept the target by  $W_h$
- Altitude Cost:
  - Multiply the required change in altitude by  $W_a$
  - If the required altitude is lower than the current agent altitude, multiply the cost by 0.75
    - It is cheaper to lower an agent's altitude than raise it
- Velocity Cost:
  - Simply multiply the velocity change required by  $W_v$
- **Total Assignment Cost: Sum the Distance, Heading, Altitude, and Velocity cost**

# Target Assignments – Cost Matrix

- Cost Matrix calculated using Hungarian Algorithm
  - Use Python 3 scipy package `scipy.optimize.linear_sum_assignment`
  - Returns cost matrix of n targets to m agents
- Targets assigned by Cost Matrix



# Target Assignments - Example

- Eight active airborne agents
  - Each defined using parameters in Single Agent example (slides 21-26)
  - Launched from C2 helicopter ~5 seconds apart
  - Each given unique random trajectory 30 seconds after initialization
    - All agents given a 10 degree rate of climb
- Define 8 target flyovers
  - Command flyovers to swarm 120 seconds after 1<sup>st</sup> drone initialization
  - Target flyovers defined on next slide

# Target Assignments – Example, Continued

- Weights used in assignment:
  - $W_d : 10$
  - $W_a : 1$
  - $W_v : 0.1$
  - $W_h : 100$
  - Assumptions:
    - Distance from target is more important than altitude change required
    - Velocity change required is not very important because FANGS will speed each aircraft up before intercept
    - Heading change is very important because turning induces instability and costs a lot of flight time

# Target Assignments – Example, Continued

## 8 Flyover Assignments

Target	Latitude (Deg, North)	Longitude (Deg, West)	Altitude (MSL)	Groundspeed (knots)
1	36.530367	112.057600	11000	50
2	36.179491	111.951595	12000	50
3	36.276756	112.687766	9600	50
4	36.542782	112.124202	12000	50
5	36.089355	112.409598	10000	50
6	36.218540	111.969167	12600	50
7	36.449291	112.399009	7700	50
8	36.580698	111.866192	9000	50

# Target Assignments – Example, Continued

## Agent States at 120 seconds (time of cost estimate)

Agent	Latitude (Deg, North)	Longitude (Deg, West)	Altitude (MSL)	Groundspeed (knots)	Heading (Deg)	Flight Path Angle (Deg)
1	36.23111	-112.27017	8525.751	80.058	182.888	10.00212
2	36.25135	-112.24750	9046.887	106.007	99.566	10.00093
3	36.23797	-112.29225	8535.040	96.050	268.649	10.01889
4	36.26619	-112.28151	8425.689	80.023	1.920	9.999995
5	36.23514	-112.27546	8424.269	102.037	208.198	10.02664
6	36.25800	-112.26417	8195.515	94.866	82.316	10.00612
7	36.23767	-112.28039	8077.037	84.689	225.048	10.03656
8	36.23940	-112.28349	8047.320	90.942	245.432	10.07828

# Target Assignments – Example, Continued

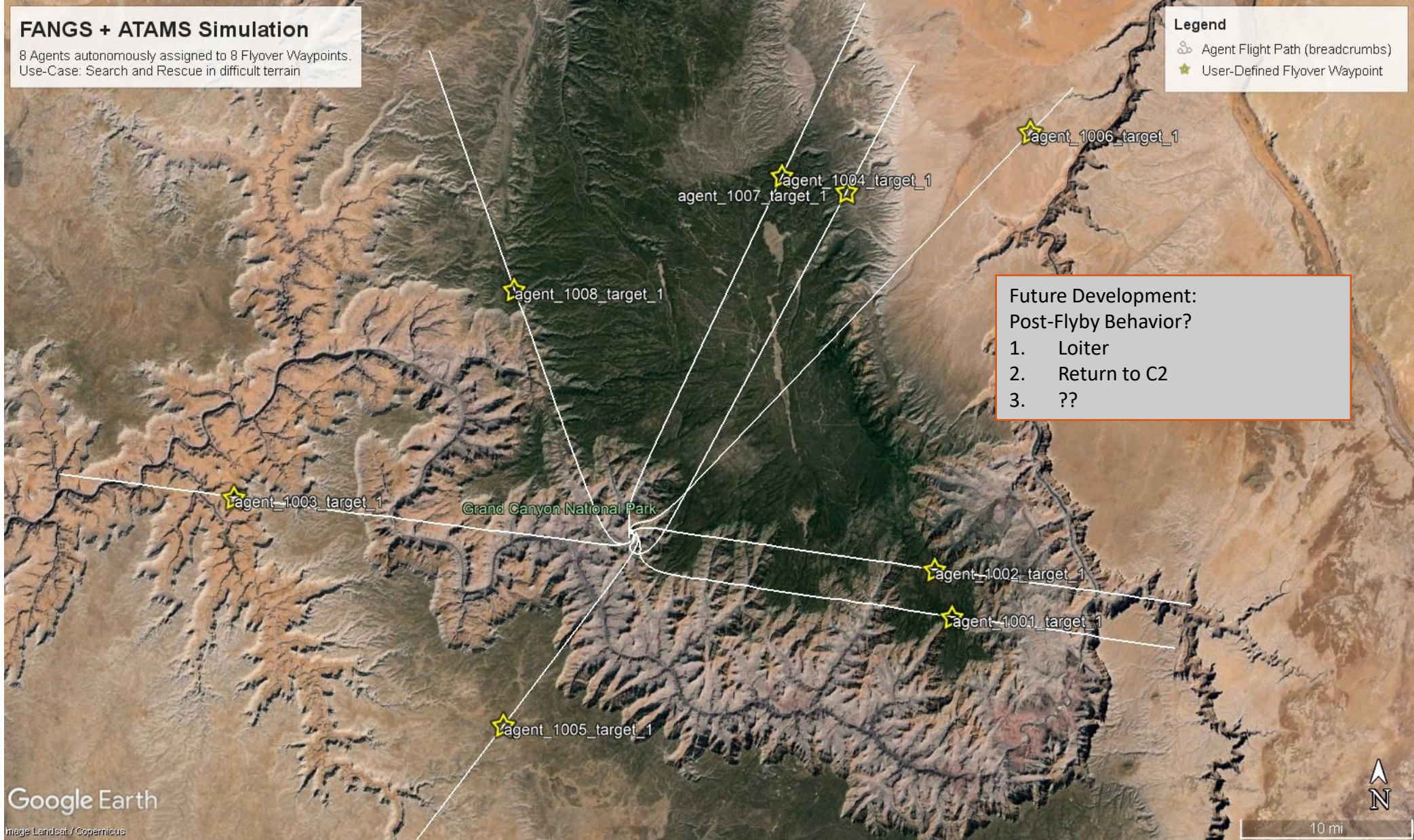
Agent-Target Cost Matrix with Optimal Assignments

	AGENT 1	AGENT 2	AGENT 3	AGENT 4	AGENT 5	AGENT 6	AGENT 7	AGENT 8
TARGET 1	2980.23	3798.31	1475.21	3988.04	1661.90	4399.78	<b>1051.47</b>	1049.03
TARGET 2	<b>2298.85</b>	3139.92	1106.01	3309.01	1307.57	3714.36	1401.93	447.31
TARGET 3	2923.33	3951.30	<b>1302.78</b>	3897.66	1685.80	4551.22	905.93	1038.87
TARGET 4	2852.11	3953.20	1558.17	<b>3824.42</b>	1980.81	4524.15	738.10	969.83
TARGET 5	3124.64	3947.58	1529.54	4108.66	<b>1717.72</b>	4548.34	929.64	1194.79
TARGET 6	3114.98	<b>4031.45</b>	1936.90	4123.21	2178.88	4601.87	719.90	1185.37
TARGET 7	3450.58	4324.94	1842.07	4425.55	2065.54	4925.22	636.43	<b>1565.91</b>
TARGET 8	3446.11	4392.38	1834.55	4420.77	2133.14	<b>4992.35</b>	578.07	1561.64

Total assignment cost = 20784.93



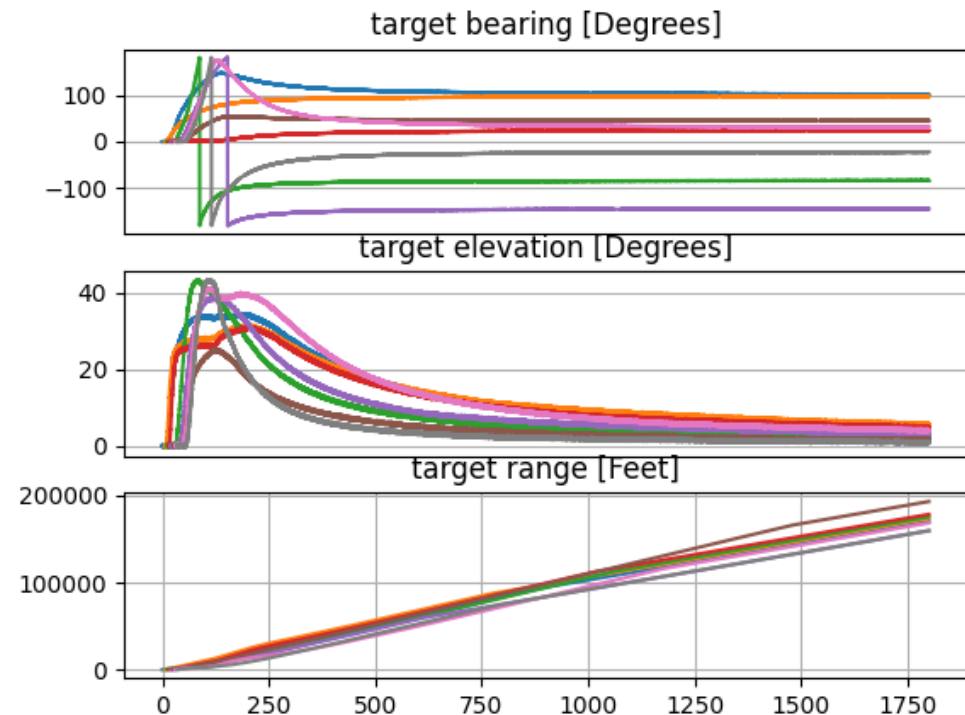
# Results





# Future Development - Agent Tracking

- Each agent tracked by the C2
  - Assumption: onboard radar, infrared, or other sensor system
- Raw track data output by FANGS
  - Target bearing, elevation, and range relative to C2
  - Simulated sensor noise
    - Gaussian noise
    - Future iterations may simulate false tracks, track drop-outs, non-Gaussian noise, and range-dependent noise



# Future Development - Agent Tracking, Continued

- Future Development: Implement random finite-set based tracking algorithms from University of Alabama LAGER Python package CARBS.
- Add air-to-air targets and track these targets
  - Intercept air-to-air targets with drones commanded by FANGS