# Unicycle Platoon Verification Challenge Arvind Adimoolam and Indranil Saha



Indian Institute of Technology-Kanpur

- 1. Easy: 3-Dimensional Unicycle, Reachability Analysis
- 2. Difficult: Platoon Model 12 dimensional
- Contrast difficulty of Platoon Reachability Analysis with Single Unicycle
- 4. Verification Problem and Compare Different Algorithms

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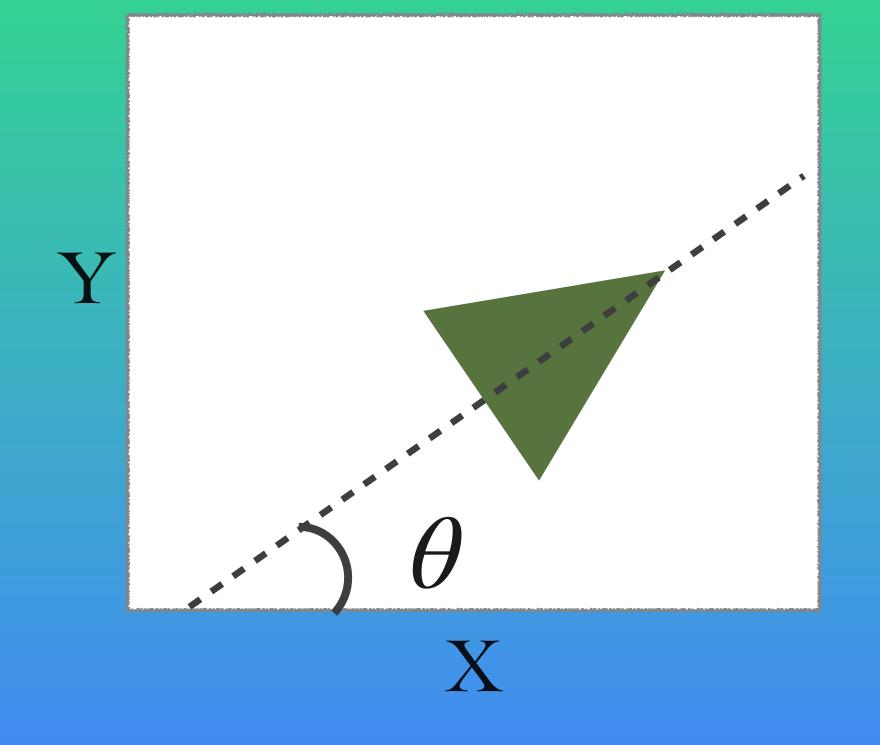
# Unicycle model

• Approximate robot movement in 2D

$$\dot{x}(t) = u(t) \cos \left(\theta(t)\right)$$

$$\dot{y}(t) = u(t) \sin \left(\theta(t)\right)$$

$$\dot{\theta}(t) = w(t)$$



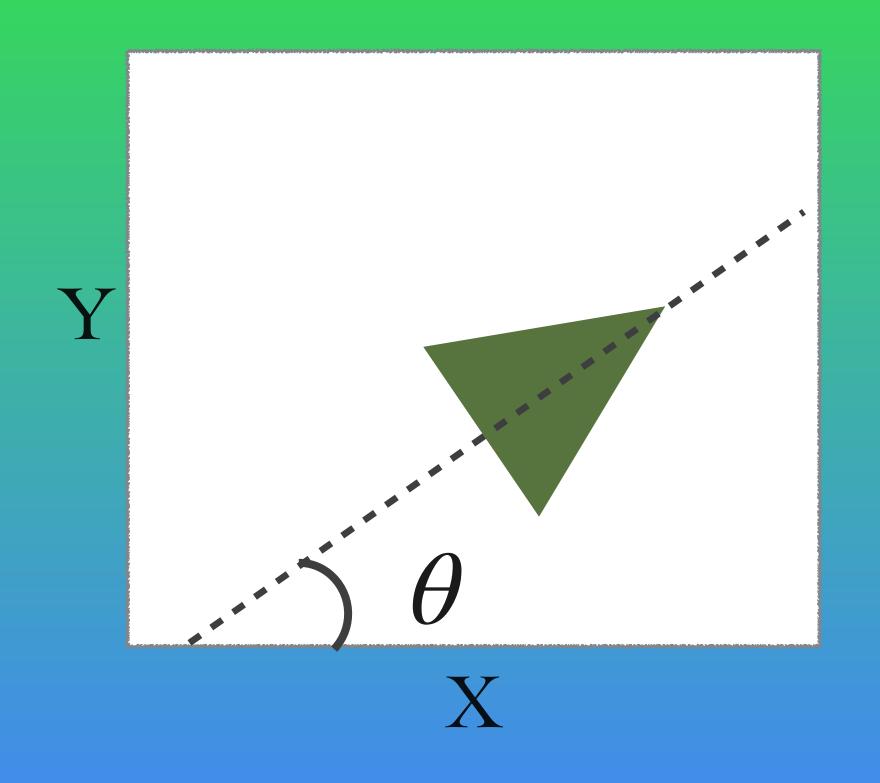
# Unicycle Model with Angular Feedback

$$\dot{x}(t) = u(t) \cos \left(\theta(t)\right)$$

$$\dot{y}(t) = u(t) \sin \left(\theta(t)\right)$$

$$\dot{\theta}(t) = -\lambda \theta(t)$$

 $\lambda$ : exponent for rate of convergence



## A Reachability Problem for Single Unicycle

$$\dot{x}(t) = u(t) \cos \left(\theta(t)\right)$$

$$\dot{y}(t) = u(t) \sin \left(\theta(t)\right)$$

$$\dot{\theta}(t) = -\lambda \theta(t)$$

λ: rate of stabilization

#### Given

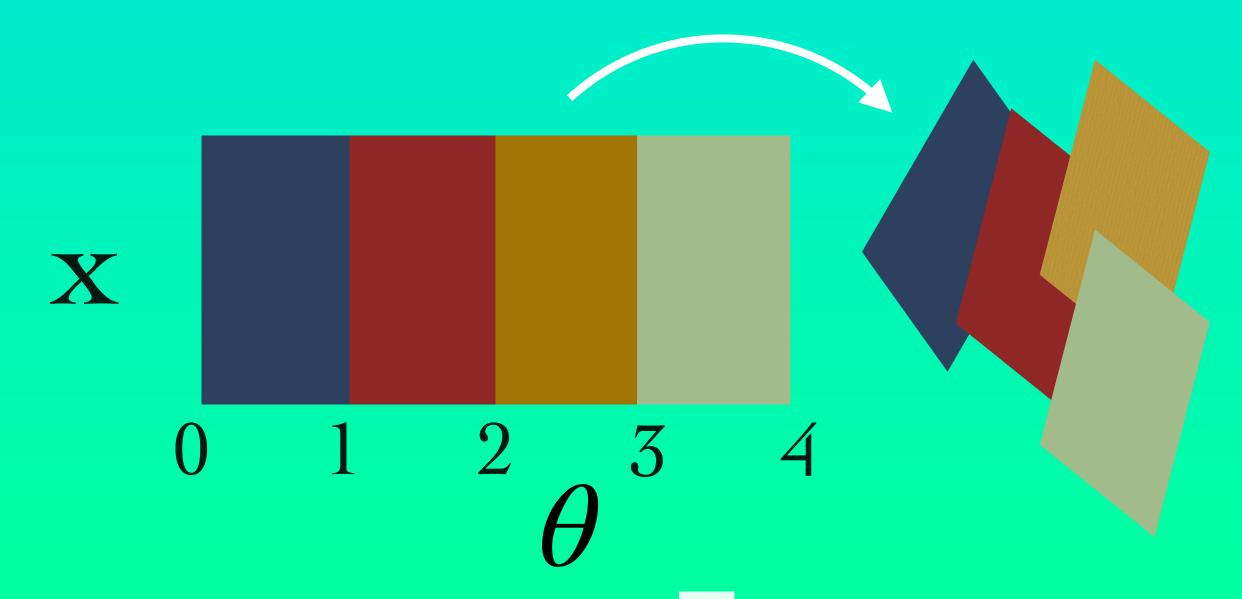
- Initial:  $(x(0), y(0), \theta(0)) \in Box(c, r), c, r \in \mathbb{R}^3$
- Input bounds:  $u(t) \in [a, b]$
- Direction  $p \in \mathbb{R}^2$ , time t

Compute directional bounds:

$$\sup \left\{ p^T \begin{bmatrix} x(t) \\ y(t) \end{bmatrix} \mid (x, y, \theta) : \text{trajectory of unicycle} \right\}$$

# Reachability Approach for Easy 3-dimensional model: Break Initial Angle for Accuracy

- Divide initial set along  $\theta$ -axis and linearize (piecewise)
- Compute reachable set post piecewise linearization (on the fly)



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## Unicycle Platoon with Feedback: Coupling different Unicycles

• Feedback controls lateral drift and inter vehicle distance

$$\dot{x}_i(t) = u_i(t) \cos \left(\theta_i(t)\right)$$

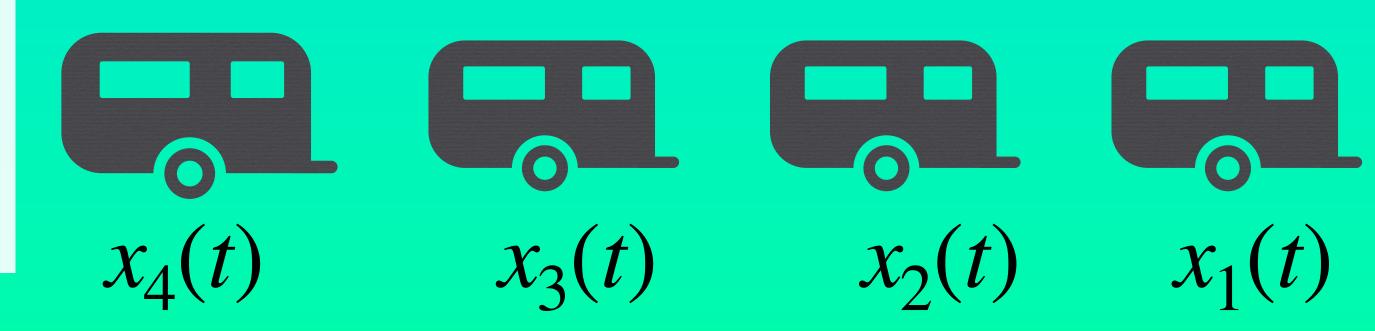
$$\dot{y}_i(t) = u_i(t) \sin \left(\theta_i(t)\right)$$

$$\dot{\theta}_i(t) = g(x_i(t))$$

$$u_i(t) = f\left(x_{i-1}(t), x_i(t), \theta_i(t), v(t)\right)$$

• f, g can be nonlinear feedback

$$i \in \{1, \dots, N\} \quad N \ge 4$$



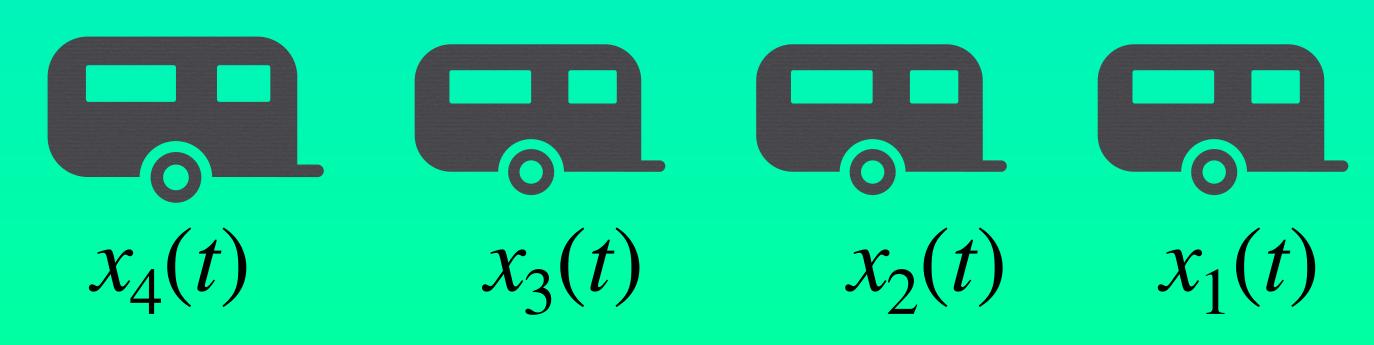
## Unicycle Platoon Model

$$\dot{x}_i(t) = u_i(t) \cos \left(\theta_i(t)\right)$$

$$\dot{y}_i(t) = u_i(t) \sin \left(\theta_i(t)\right)$$

$$\dot{\theta}_i(t) = -\theta_i(t)\left(0.5 + 2\theta_i(t)^2\right)$$

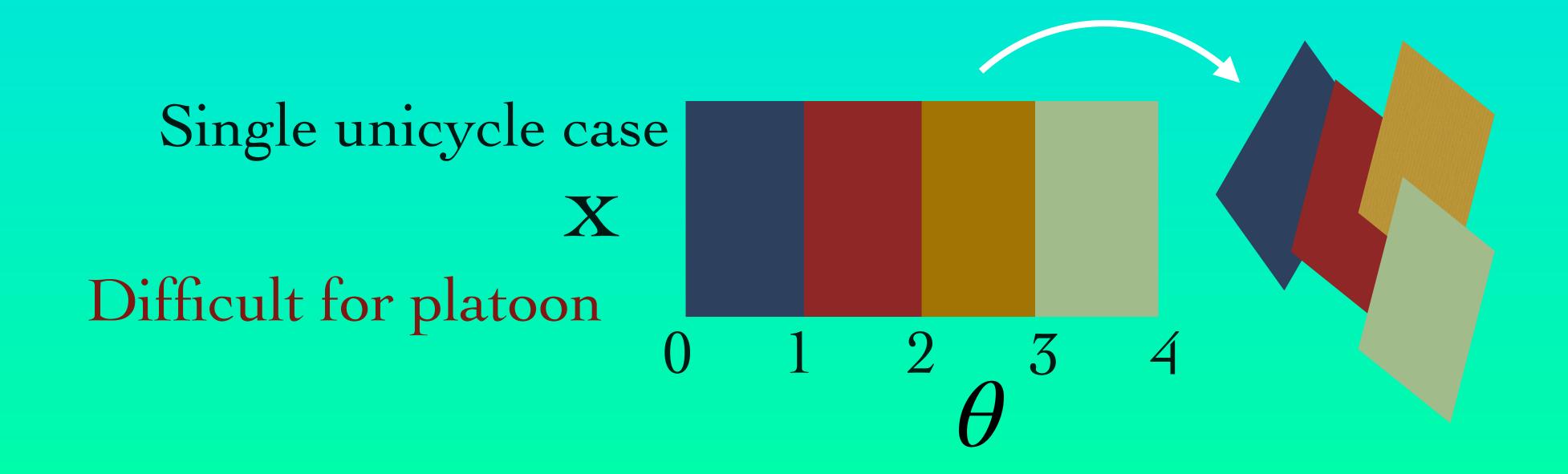
if 
$$i=1$$
, then 
$$u_i(t)=\frac{v(t)}{1+\theta_i(t)^2}$$
 if  $2\leq i\leq N$ , then 
$$u_i(t)=\frac{0.3\left(x_{i-1}-x_i+10\right)}{1+\theta_i(t)^2}$$



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# Contrast with single unicycle case

- Appropriate division of initial is difficult to find.
- Division along all axes computationally intractable!!



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## Unicycle Platoon Verification Challenge: Initial Conditions and Input Bounds

$$x_1(0) \in [60,70]$$

$$y_1(0) \in [0,0]$$

$$\theta_1(0) \in [-0.5, 0.5]$$
 v = 5 m/s

$$v = 5 \text{ m/s}$$

$$x_2(0) \in [40,50]$$

$$y_2(0) \in [0,0]$$

$$\theta_2(0) \in [-0.5, 0.5]$$

$$x_3(0) \in [20,30]$$

$$y_3(0) \in [0,0]$$

$$\theta_3(0) \in [-0.5, 0.5]$$

$$x_4(0) \in [0,10]$$

$$y_4(0) \in [0,0]$$

$$\theta_4(0) \in [-0.5, 0.5]$$

Num robots = 4

# Unicycle Platoon Verification Challenge: Property 1

Inter-robot horizontal displacement

Find maximum d, e

1. 
$$\forall t \in [0,5] \forall i \in \{1,2,3\} (x_i(t) - x_{i+1}(t)) \ge d$$
 (bounded time)

2. 
$$\forall t \in [0,\infty) \forall i \in \{1,2,3\} (x_i(t) - x_{i+1}(t)) \ge e$$
 (unbounded time)

# Unicycle Platoon Verification Challenge: Property 2

Lateral drift

Find minimum d, e

1. 
$$\forall t \in [0,5] \forall i \in \{1,2,3,4\} | y_i(t) | \le d$$
 (bounded time)

$$2. \forall t \in [0,\infty) \forall i \in \{1,2,3,4\} \mid y_i(t) \mid \le e \text{ (unbounded time)}$$

# Unicycle Platoon Verification Challenge: Property 3

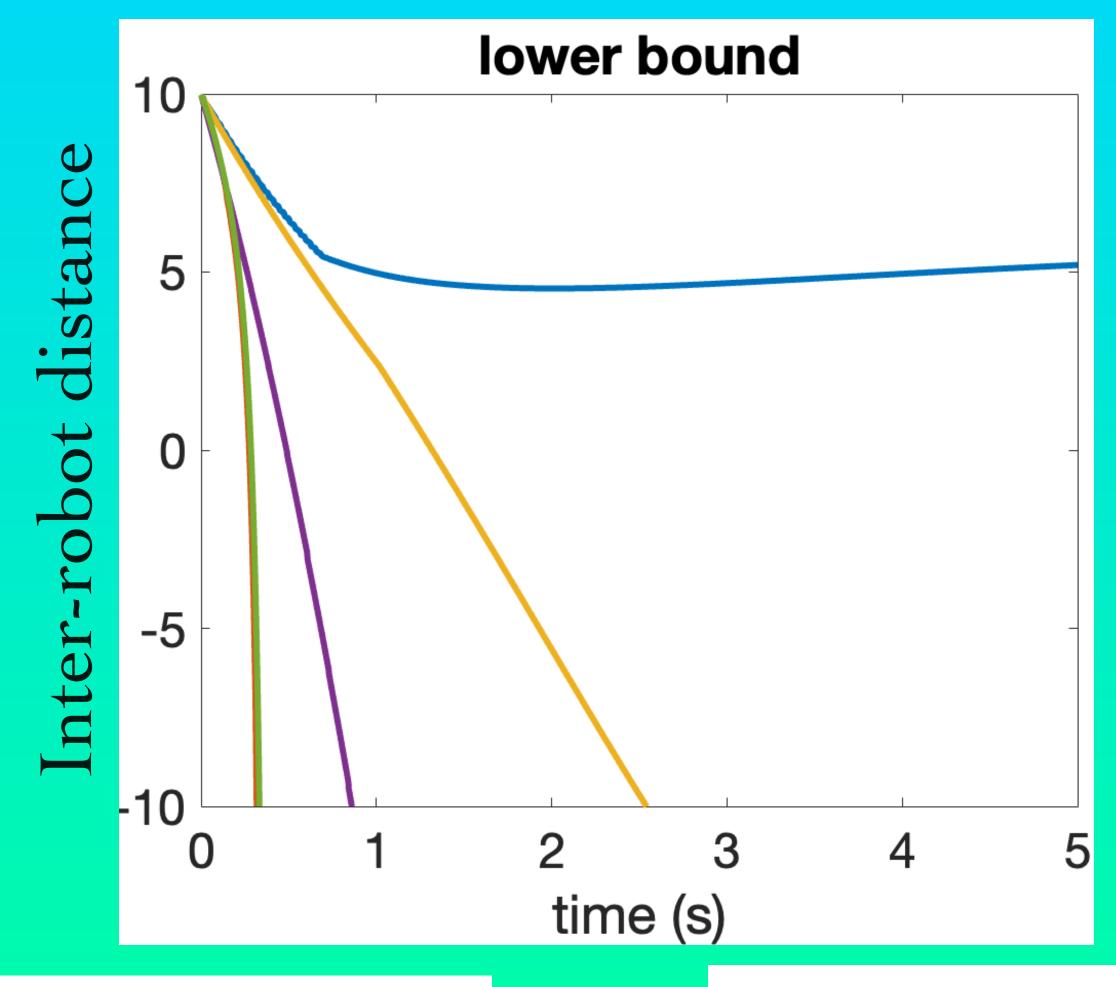
Convergence of robots

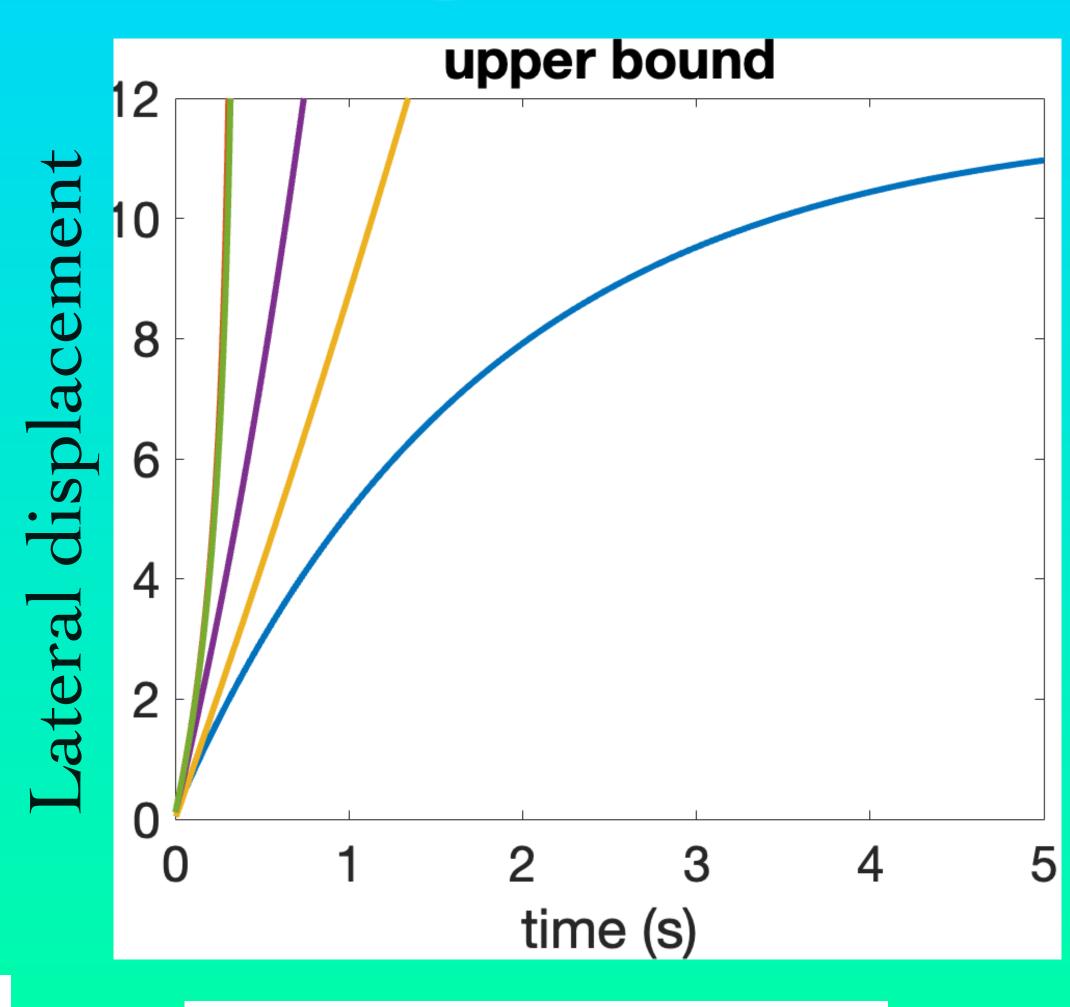
Find minimum d, e

1. 
$$\forall t \in [5,10] \forall i \in \{1,2,3\} (x_i(t) - x_{i+1}(t)) \le d$$
 (bounded time)

2. 
$$\forall t \in [5,\infty] \forall i \in \{1,2,3\} (x_i(t) - x_{i+1}(t)) \le e$$
 (unbounded time)

# Comparison of Different Algorithms





Taylor model

—iou zonotope

—polynomial zonotope

single objective optimization

—conservative linearization

## Summary

- Proposed Unicycle Platoon Model 12
   dimensional, tight coupling between robots
- Three properties to verify (or compute bounds)
- Compared different algorithms in bounded time case.

# Possible Extensions of Challenge

Increase Number of Robots

(model is easily scalable)

Compute Initial Conditions