

# Ordered formation control and affine transformation of Multi-Agent Systems without global reference frame

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National Taiwan University



# Outline

- 1 Introduction
  - What is MAS Formation Control?
  - What is our objective?
  - What is the importance?
- 2 Problem Formulation
- 3 Phase Penalty Flow Exchange Mechanism
  - Motivation
  - Design
- 4 Simulation Result
- 5 Conclusion



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# Introduction - formation control

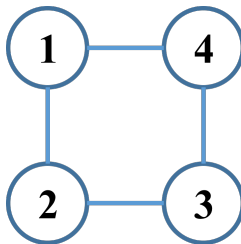


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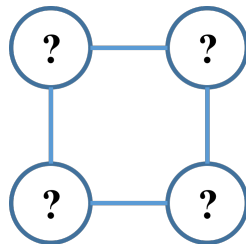
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# Introduction - objective

- Ordered formation



(a) Order

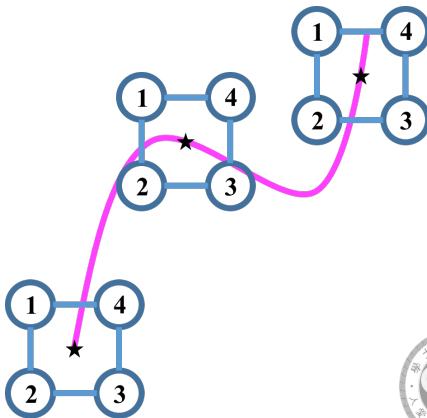


(b) Disorder



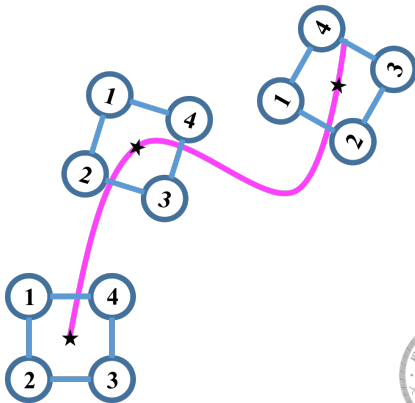
# Introduction - objective

- Ordered formation
- Tracking



# Introduction - objective

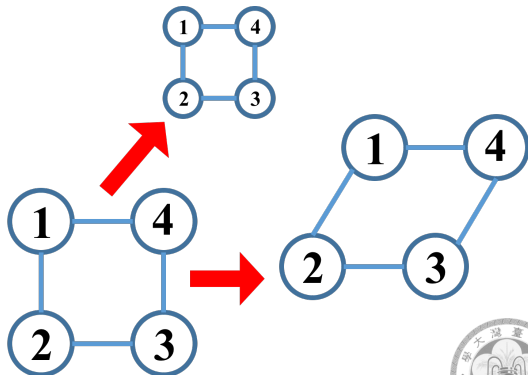
- Ordered formation
- Tracking
- Rotating





# Introduction - objective

- Ordered formation
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# Introduction - objective

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# Introduction - objective

- Ordered formation
- Tracking
- Rotating
- Transforming
  
- Distributed Communications
- Nonholonomic Constraints



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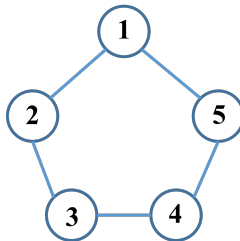
# Introduction - importance

- Ordered formation
- Tracking
- Rotating
- Transforming

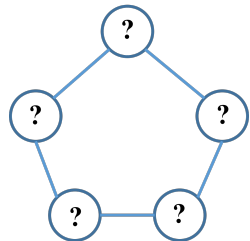


# Introduction - importance

- Ordered formation  
sensor fusion
- Tracking
- Rotating
- Transforming



(a) order

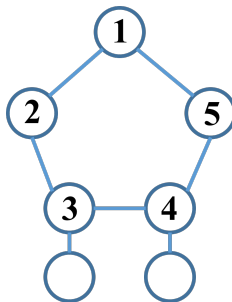


(b) disorder

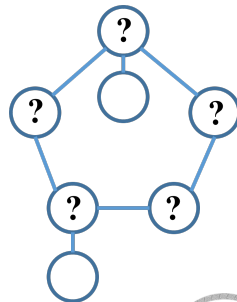


# Introduction - importance

- Ordered formation
  - sensor fusion
  - group synthesis
- Tracking
- Rotating
- Transforming



(a) order



(b) disorder



# Introduction - importance

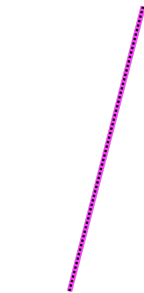
- Ordered formation
  - sensor fusion
  - group synthesis
- Tracking
  - common task
- Rotating
- Transforming



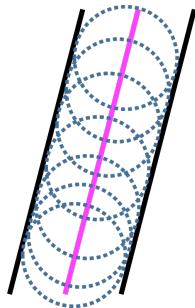


# Introduction - importance

- Ordered formation
  - sensor fusion
  - group synthesis
- Tracking
  - common task
- Rotating
  - area extension
  - bias reduction
- Transforming



(a) only tracking

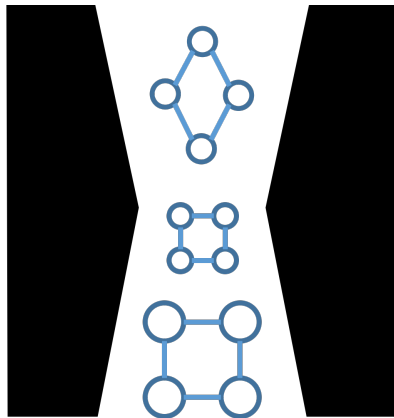


(b) tracking + rotating



# Introduction - importance

- Ordered formation
  - sensor fusion
  - group synthesis
- Tracking
  - common task
- Rotating
  - area extension
  - bias reduction
- Transforming
  - adaptation



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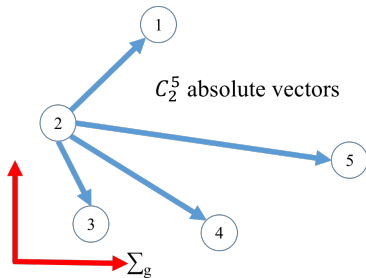
# Problem Formulation

- Three main factors:
  - communications
  - desired shape
  - agents

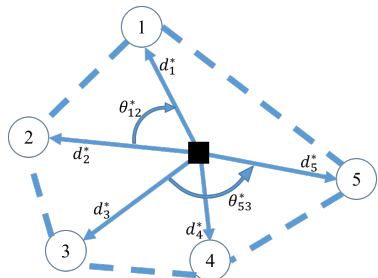


# Problem Formulation - desired formation shape

Most papers:



Our thought:



- pros: frame-invariant
- cons: centroid determination

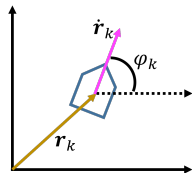


# Problem Formulation - dynamic model

- Recall nonholonomic constraint:

$$\dot{\mathbf{r}}_k = v_k \begin{bmatrix} \cos \varphi_k \\ \sin \varphi_k \end{bmatrix}$$

$$\dot{\varphi}_k = u_k$$

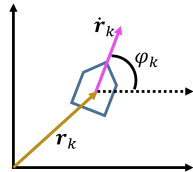


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- Extended Model:

$$\dot{\mathbf{r}}_k = d_k^* (\varpi \mathbf{G}_k - \dot{\mathbf{G}}_k \mathbf{R}_{\frac{\pi}{2}}) \begin{bmatrix} \cos \theta_k \\ \sin \theta_k \end{bmatrix} + \mathbf{v}_k$$

$$\dot{\theta}_k = \bar{u}_k, \dot{\mathbf{v}}_k = \boldsymbol{\tau}_k$$

Note:  $\mathbf{G}_k \in \mathbb{R}^{2 \times 2}$  is a linear transformation matrix

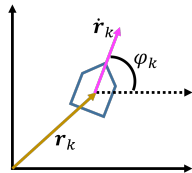


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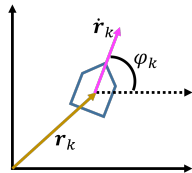


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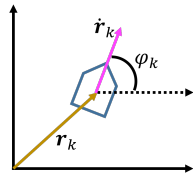


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# Problem Formulation - proposed problem

Given Information: ( $M$  agents)

- desired shape  $\{d_k^*, \theta_{kj}^*\}$
- tracking reference  $r_d$
- angular velocity  $\varpi_0$
- transformation reference  $G^*$

Objectives:

- $\theta_{kj} \rightarrow \theta_{kj}^*$
- $r_k \rightarrow d_k^* G_k [\sin \theta_k, -\cos \theta_k]^T + r_d$
- $\bar{u}_k \rightarrow \varpi_0$
- $G_k \rightarrow G^*$



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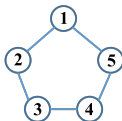


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# Mechanism - motivation

- Desired formation shape:

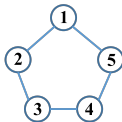


- Assume that  $N_1 = \{2, 5\}$ ,  
 $N_2 = \{3, 1\}$ ,  $N_3 = \{4, 2\}$ ,  
 $N_4 = \{5, 3\}$ ,  $N_5 = \{1, 4\}$

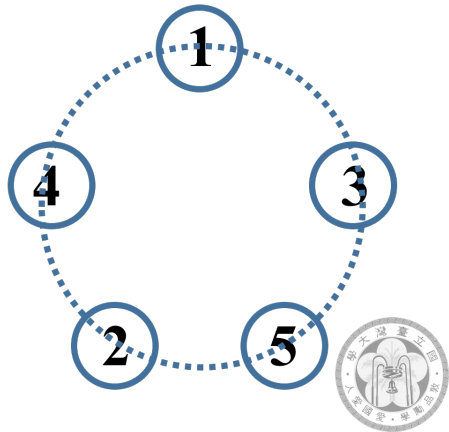


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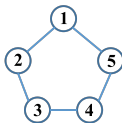


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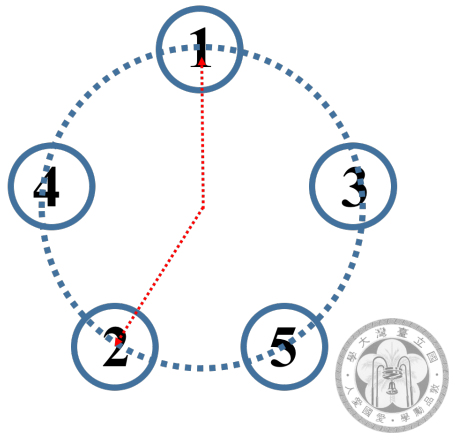


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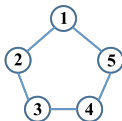
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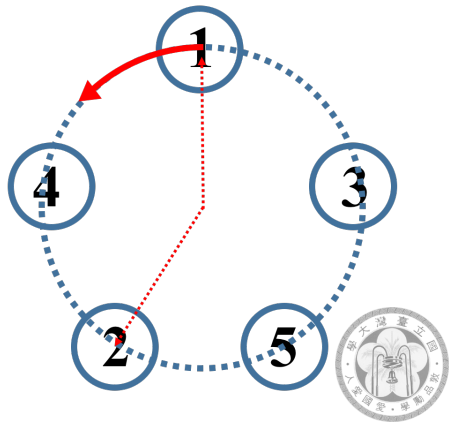


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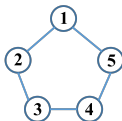


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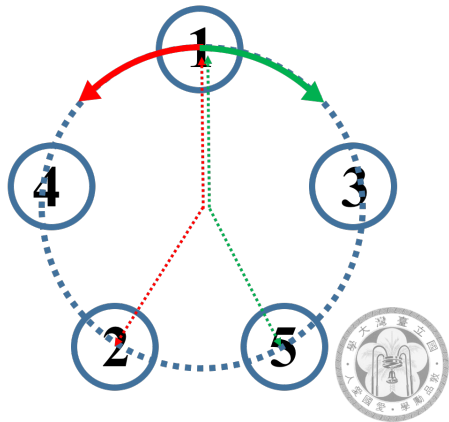


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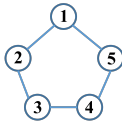


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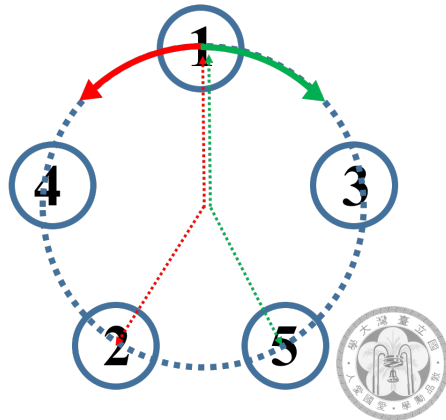


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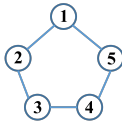


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- Two directions cancel out
- Stuck in incorrect order

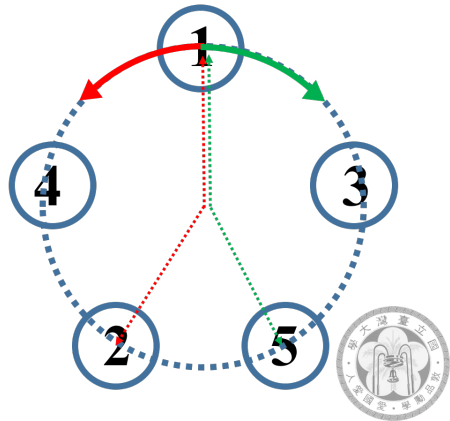


# Mechanism - motivation

- Desired formation shape:



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  - Two directions cancel out
  - Stuck in incorrect order
- ⇒ Time varying weight to resolve cancellation



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# Mechanism - design I

## Definition

- phase penalty  $\zeta_k$ :  $\sum_{j \in N_k} (1 - \cos(\theta_{kj} - \theta_{kj}^*))$
- weighting parameter  $w_k$ :  $w_k(t) \geq \underline{w}_k > 0$
- phase penalty flow  $\Phi_k$ :  $(w_k - \underline{w}_k)\zeta_k$



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## Phase Penalty Flow Exchange Mechanism

Each agent distributes out its  $\Phi_k$  to neighbors.

## Example

Denote  $\phi_{kj}$  as the amount agent- $k$  distributes to agent- $j$ , then  
$$\Phi_k = \sum_{j \in N_k} \phi_{kj}$$



# Mechanism - design II

- How to design the update law of  $w_k$ ?  
Consider a fixed formation with exchange mechanism.





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- How to design the update law of  $w_k$ ?  
Consider a fixed formation with exchange mechanism.
  - Net flow:  $-\Phi_k + \sum_{j \in N_k} \phi_{jk}$
  - Total net flow:  $\sum_{k=1}^M (-\Phi_k + \sum_{j \in N_k} \phi_{jk}) = 0$



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- $\frac{d}{dt}(\sum_{k=1}^M \Phi_k) = 0 = \sum_{k=1}^M \dot{w}_k \zeta_k$

$$\Rightarrow \dot{w}_k = \frac{c}{\zeta_k} (-\Phi_k + \sum_{j \in N_k} \phi_{jk}), \text{ } c \text{ is a constant}$$



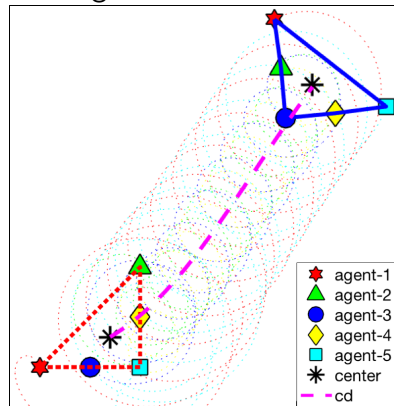
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# Simulation Results

- Overall result

- Paradigm - order issue



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# Conclusion

- Design a control law such that the MAS tracks, rotates, adapts, and forms in order.
- Propose “phase penalty flow exchange mechanism” to achieve ordered formation.
- Provide stability analysis and some simulation results.
- Future work: extend to spatial case (3D)

