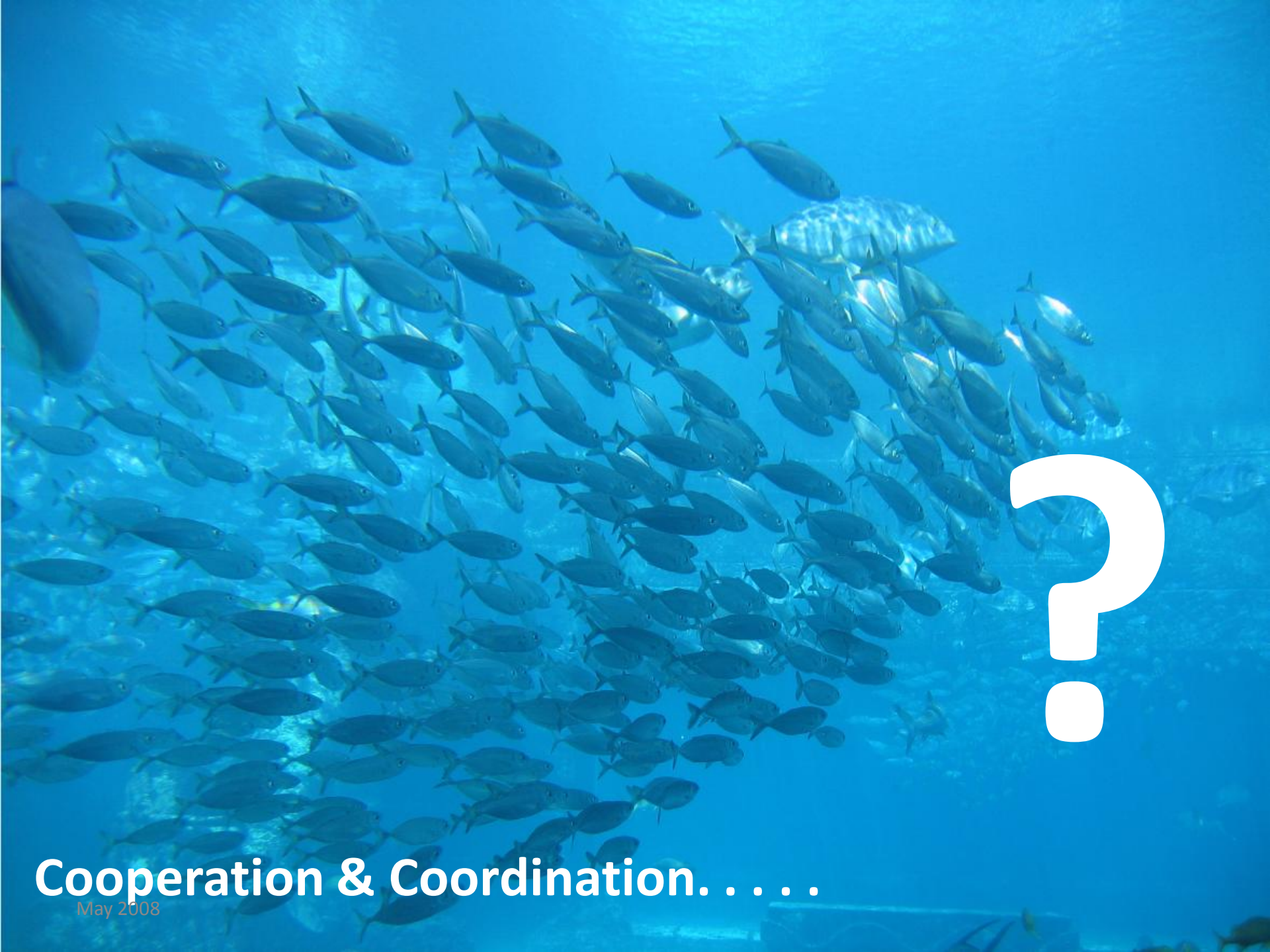


KFUPM
EE 550 – Linear Control Systems
Course Paper

Cooperative Control of Multi-Vehicle Systems

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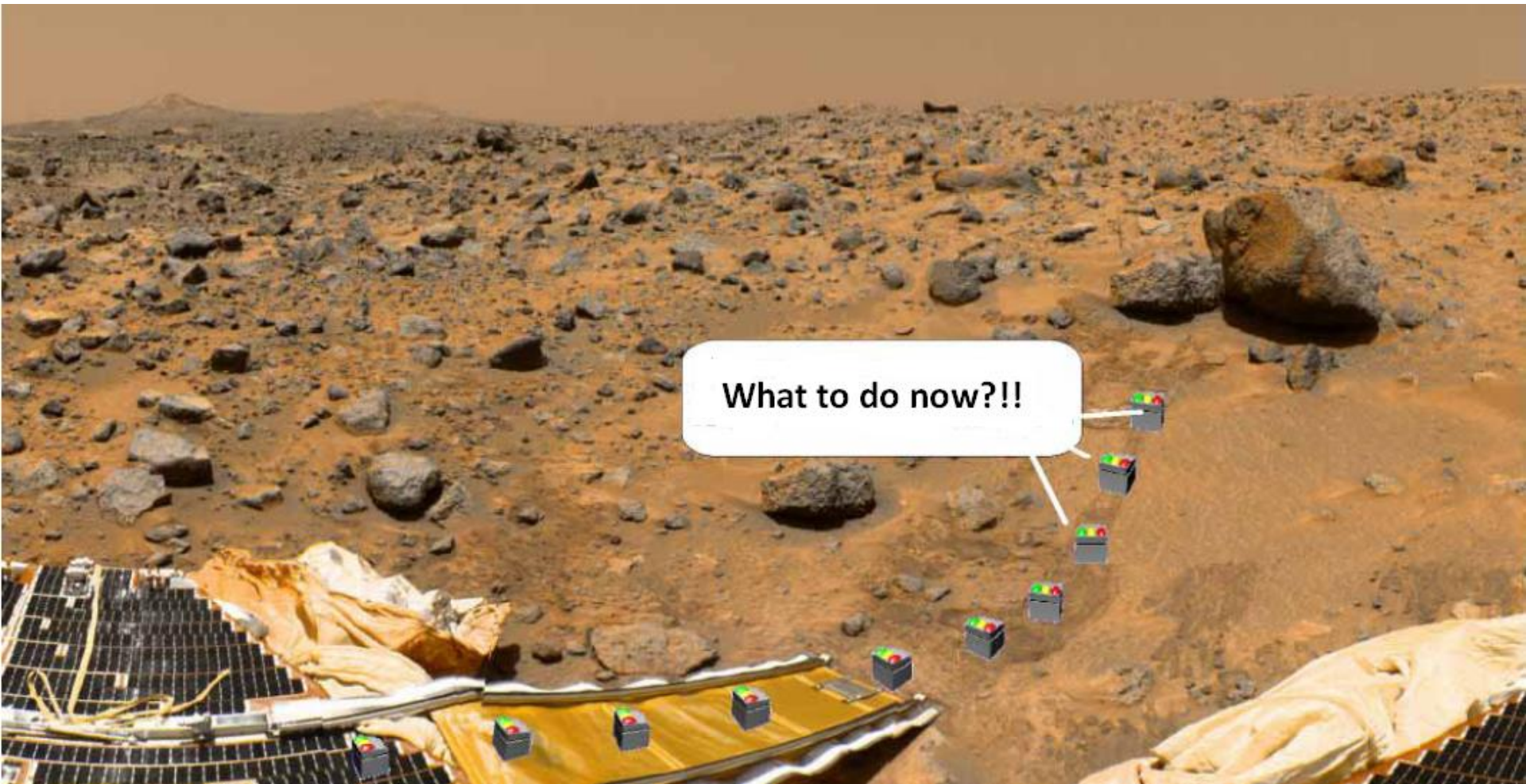
May 2008



Cooperation & Coordination.

May 2008

Mars Exploration



How to control each one?..... Command Center? Local Decision?

Automated Transportation Systems



How to arrange vehicles?... Straight line? Triangular?

Outline

1. Motivation
2. Definitions: Cooperative Control
 1. Consensus Problem
 2. Formation Control
 3. Other: Rendezvous, Flocking, Swarming
3. Decentralized Control
4. Connectivity Graphs
5. Control Design
6. Research Directions
7. Simulation Examples

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Motivation

- **Distributed Operation**
- **Multi Agents**: vehicles, manipulators, ants!
- **Local Control**: Local objectives, independent
- **Limited Capability**: Sensing range, Communication, Processing
- **Global Objectives**: Group goal, Higher-level command
- **Complexity**: too many agents
- **Scalability**, large and not fixed number of interconnected systems
- **Dynamic**: reactive and instantaneous actions

Cooperative Control, Definition

- is concerned with engineered systems that can be characterized as:
 1. *collection* of
 2. *interconnected* decision-making components (systems)
 3. with *limited processing* capabilities,
 4. *locally sensed information* and *limited inter-component communications*,
 5. all seeking to achieve a *collective (global) objective*
- ‘multi-agent control’, ‘distributed control’, ‘networked control’, ‘swarms’ or ‘coordinated control’ = Cooperative Control

Consensus Problem

- “the group to reach a position (or agreement) as whole”

$$\lim_{t \rightarrow \infty} x_i(t) = \lim_{t \rightarrow \infty} x_j(t) \quad (1)$$

x_i Position of vehicle i

- This behavior can be defined by

$$\dot{x}_i = \sum a_{ij} \cdot (x_i - x_j)$$

– averaging

Formation Control

- “to drive the agents to special configuration such that their relative position satisfy a desired spatial and physical constraints”

$$\dot{x}_i = \sum (x_i - x_j - r_{ij})$$

- Or in general

$$\dot{x}_i = \sum g(x_i - x_j)$$



Other concepts

- **Swarms**

- “to move or gather in group”
- a specific formation (shape) is not maintained
- ‘swarm’ often used for *natural biological systems*

- **Rendezvous**

- “to meet at a pre-arranged position and time”
- when an agent is approaching its destination faster than other, it tries *dynamically* to slow down to meet the requirement of the group in position and time (**Military** application)

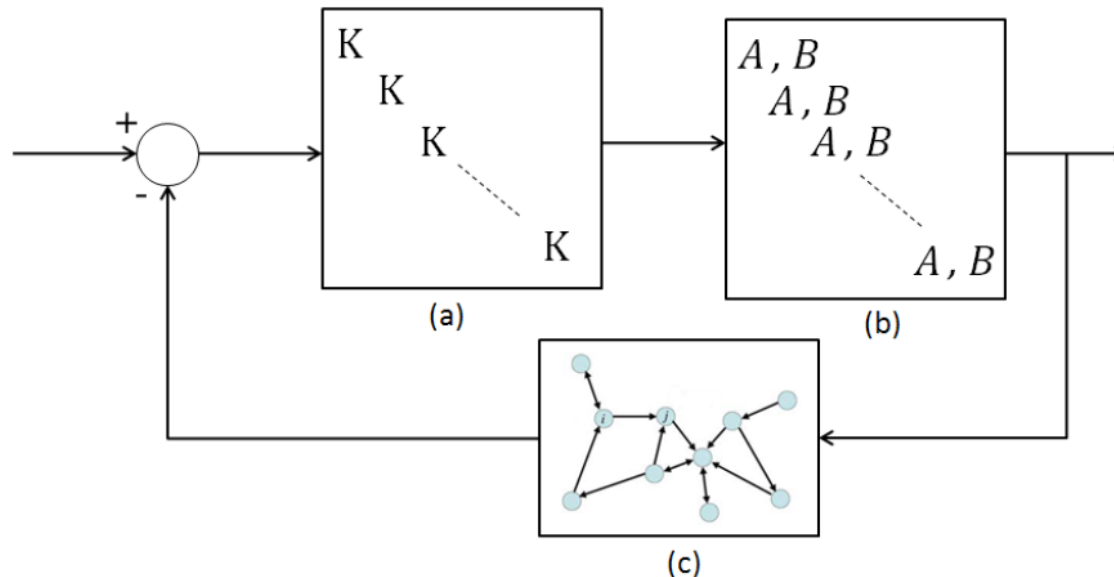
- **Flocking**, Rules of *Reynolds*:

- to stay close to neighboring flock mates (Cohesion);
- to avoid collision with neighboring flock mates (Separation);
- to match velocity of neighboring flock mates (Alignment).



Decentralized Control

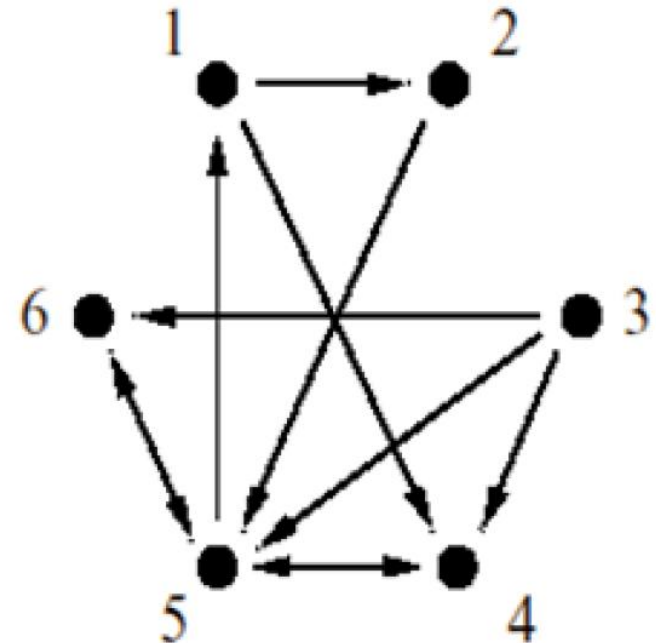
- Decisions (control) of each individual agent is computed *locally*
 - No Central center of control
 - No coupling
- Decentralized Controller:
 - properly designed to meet the objective of the whole group
 - cooperation needs sharing information, through *communication*



Connectivity Graphs

- Utilize *Graph Theory*
 - Assuming access to neighbor's state (position), only neighbors!
 - Vehicle 1 can 'see' 2,4 (so, neighbors) & vehicle 3 'see' 4,5,6
 - This connectivity graph is characterized by **Laplacian Matrix**

$$L = \begin{bmatrix} 1 & -\frac{1}{2} & 0 & -\frac{1}{2} & 0 & 0 \\ 0 & 1 & 0 & -1 & 0 & 0 \\ 0 & 0 & 1 & -\frac{1}{3} & -\frac{1}{3} & -\frac{1}{3} \\ 0 & 0 & 0 & 1 & -1 & 0 \\ -\frac{1}{3} & 0 & 0 & -\frac{1}{3} & 1 & -\frac{1}{3} \\ 0 & -\frac{1}{2} & 0 & 0 & -\frac{1}{2} & 1 \end{bmatrix}$$



Connectivity Graphs

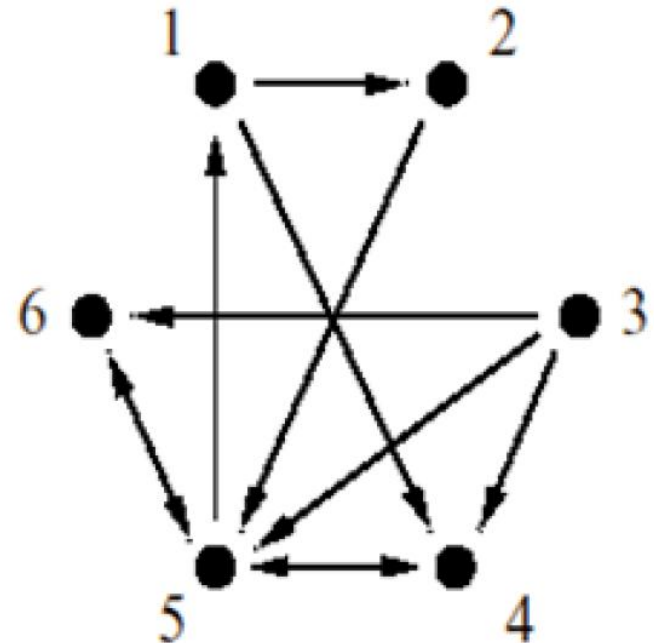
- Recall

$$\dot{x}_i = \sum_{\forall j \in \mathcal{N}_i} a_{ij} \cdot (x_i - x_j)$$

- So for a group of N vehicles,

$$\dot{\mathbf{X}} = -L\mathbf{X}$$

$$\mathbf{X} = [x_1 \quad x_2 \quad \cdots \quad x_N]^T,$$



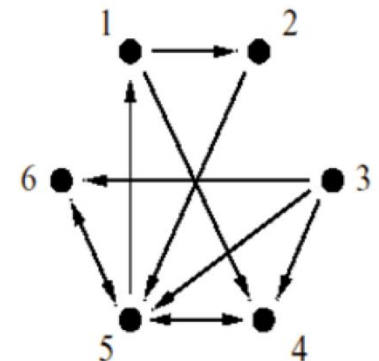
Convergence (Stability)

- You can check the eigenvalues of

$$-L.$$

- L could be *time-varying* (because of communication losses)
- A **connected** graph is when there is a **path** between any two agents
- For **undirected** graph (i.e. edges of a graph has no direction, both vehicles see the other)
 - “Consensus is reached asymptotically if there exist infinitely many consecutive bounded time intervals such that the union of the graphs over such intervals is totally connected”, [Jadbabaie et al.](#)

- Consensus point (steady state) = average of initial positions



Control Design (decentralized)

- Performance Output

$$z_i = G(x_i) = \sum_{\forall j \in \mathcal{N}_i} g(x_i - x_j)$$

Interaction Function

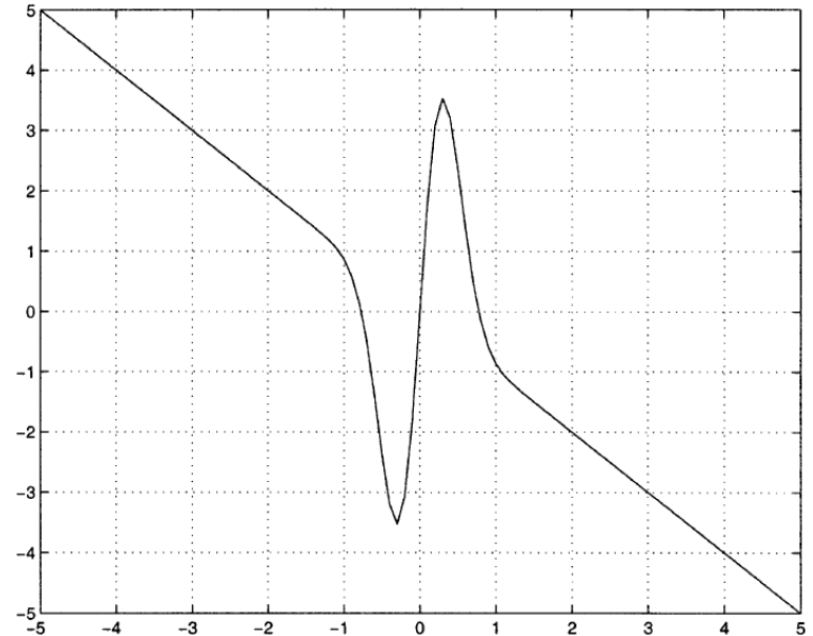
- One proposed design

$$u_i = -K \sum_{\forall j \in \mathcal{N}_i} a_{ij} \cdot (x_i - x_j)$$

- Other design

$$u_i = - \sum g(x_i - x_j - d_{ij}) \cdot (x_i - x_j - d_{ij})$$

- $g(\cdot)$ could be designed from the concept of *Artificial Potential Force*,
- Provide collision avoidance also

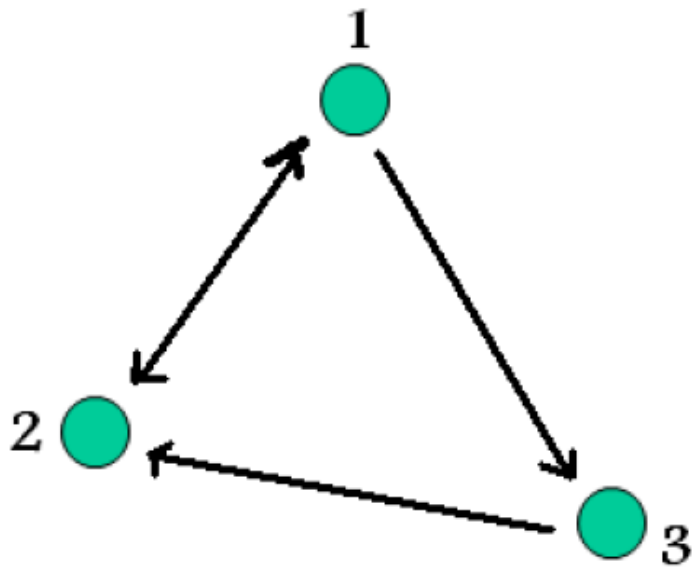


Research Directions

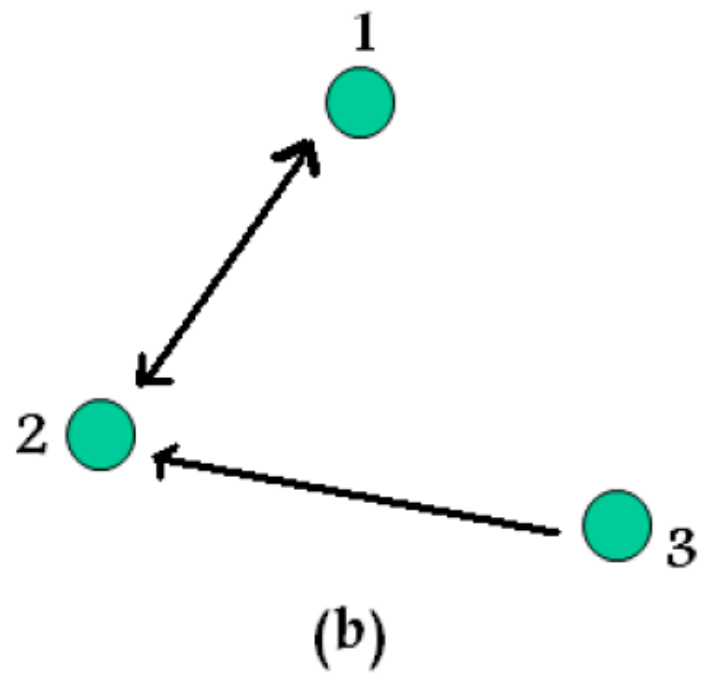
- **Cooperative State Estimation**
 - accessibility to other vehicles state, *not necessarily!*
 - existence of noise
 - Estimating $(x_i - x_j)$ (x_i not required)
- **Hybrid Control:** *Control Theory & Computing*
 - non-smooth dynamics (discontinuous)
 - for example: all of a sudden new vehicle join the group, N changed
- **Stochastic Approaches**
 - To *model* change of connectivity graphs
- **Time-delay Systems**
 - delays in information exchange between vehicles

Simulation

- Consider 2 connectivity graphs



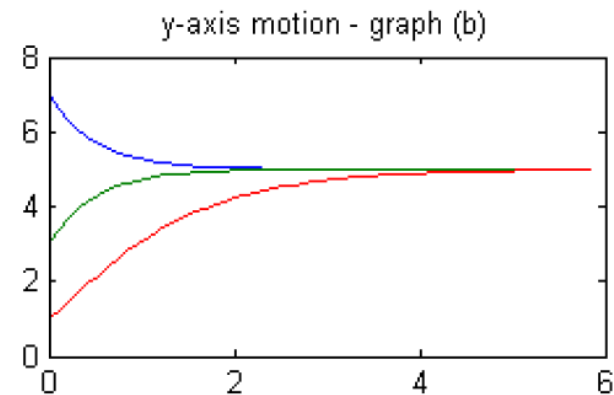
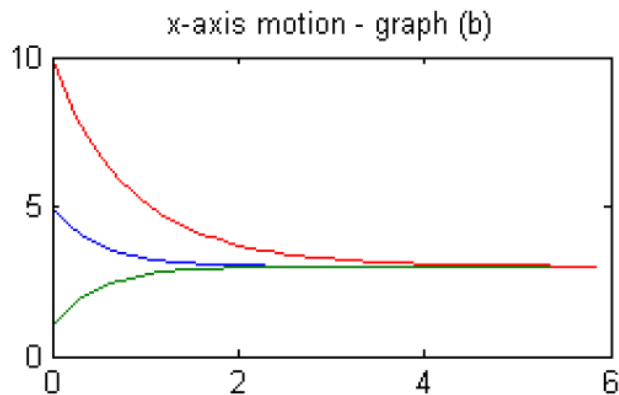
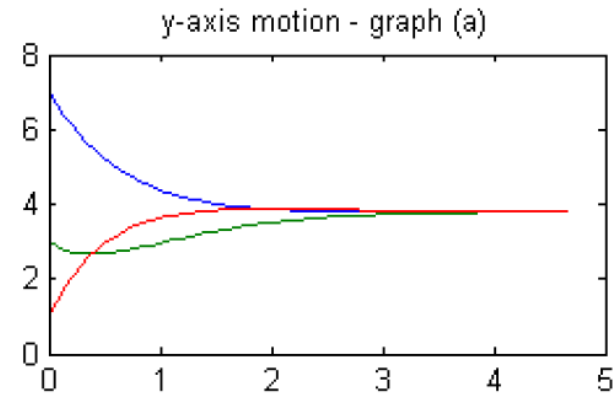
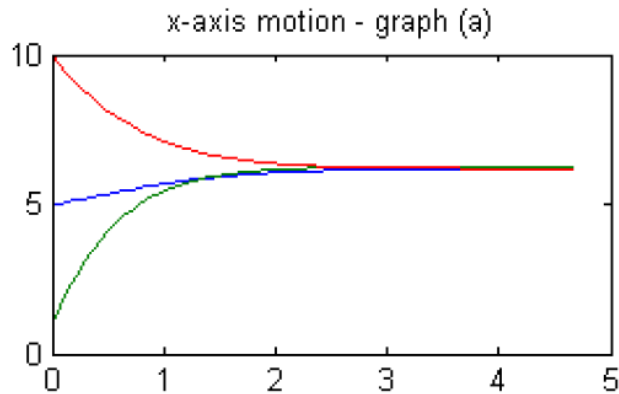
$$L = \begin{bmatrix} 1 & -1/2 & -1/2 \\ 0 & 1 & -1 \\ -1 & 0 & 1 \end{bmatrix}$$



Simulation Result

- 3 vehicles, 2D motion with single-integrator (i.e. 1st order) system.

$$\dot{X} = -LX$$



Cooperative Control, Ending Remarks

- Relatively new field of research
- Bio-inspired
- Wide and *interesting* applications
- Decentralized Solution
- Graph theory & Control Theory

THANKS

- Q & A

