

# Design of cooperative dynamic regulators for synchronization of multi-agents systems

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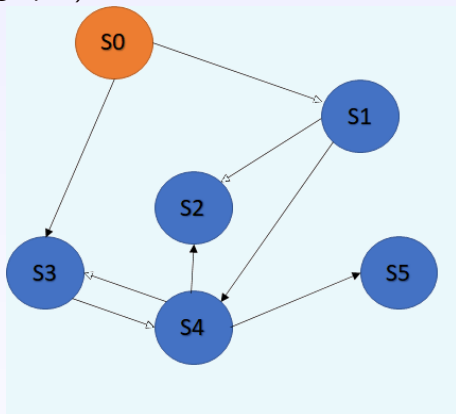
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# General formulation

- Here we will focus on CPS described as multi-agents systems modeled by means of directed graphs (digraphs)



- Each node  $S_i$  of the graph is a dynamical LTI system
- Edges are used to model communication between agents

# General formulation

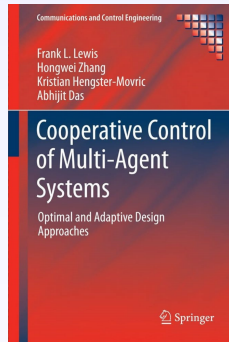
We will consider multi-agents control problems (generically called here *synchronization problems*) where the CPS is made up of

- 1 leader node  $S_0$
- $N$  follower nodes  $S_i$  ( $i = 1, 2, \dots, N$ )
- The agents cooperate in order to perform a task possibly dictated (to some extent) by the leader node
- In order to perform the assigned task the follower nodes exploit information shared on the communication network represented by the digraph  $\mathcal{G} = \{\mathcal{V}, \mathcal{E}\}$

# General formulation: cooperative tracking problems

- In this part we will mainly focus on *cooperative tracking problem* where the task to be performed is dictated by the leader node  $S_0$  which generates the desired target trajectory (acting as a command generator exosystem)
- We will use the term *cooperative regulator problem* when the consensus is sought among agents in the absence of a leader node
- Assumptions: the  $N$  follower agent are identical

- B5** *Cooperative Control of Multi-Agent Systems*, F. Lewis et al., Springer London , 2013



# Agents mathematical models

- The dynamics of the **leader node**  $S_0$  is described by

$$\dot{x}_0 = Ax_0, \quad y_0 = Cx_0 \quad (1)$$

where  $x_0 \in \mathbb{R}^n$ ,  $y_0 \in \mathbb{R}^p$

- The dynamics of the  $N$  identical **follower nodes**  $S_i$  is described by

$$\dot{x}_i = Ax_i + Bu_i, \quad y_i = Cx_i \quad (2)$$

where  $x_i \in \mathbb{R}^n$ ,  $u_i \in \mathbb{R}^m$ ,  $y_0 \in \mathbb{R}^p$  and  $i \in \mathcal{N} = \{1, 2, \dots, N\}$

- The triple  $(A, B, C)$  is *stabilizable* and *detectable*

# Communication network modeling

- The **follower nodes**  $S_i$  share information through a communication network represented as a digraph  $\mathcal{G} = \{\mathcal{V}, \mathcal{E}\}$  with  $N$  nodes  $\mathcal{V} = \{v_1, v_2, \dots, v_N\}$  and a set of edges (arcs)  $\mathcal{E} \subset \mathcal{V} \times \mathcal{V}$
- The **adjacency matrix** associated to  $\mathcal{G}$  is  $\mathcal{A} = [a_{ij}] \in \mathbb{R}^N$
- $a_{ij} > 0$  is the **weight for edge**  $(v_j, v_i)$  implying that node  $i$  can get information from node  $j$  (node  $j$  is a neighbor of node  $i$ )
- The neighbor set of node  $i$  is denoted as  $\mathcal{N}_i = \{j | a_{ij} > 0\}$
- We assume there is no self-loop ( $a_{ii} = 0, \forall i$ )
- To describe connection between the leader node and the graph  $\mathcal{G}$  of follower nodes we define the **augmented graph**  $\bar{\mathcal{G}} = \{\bar{\mathcal{V}}, \bar{\mathcal{E}}\}$  where  $\bar{\mathcal{V}} = \{v_0, v_1, \dots, v_N\}$ ,  $\bar{\mathcal{E}} \subset \bar{\mathcal{V}} \times \bar{\mathcal{V}}$

# Cooperative state variables feedback (SBVF) control

## Fundamental assumptions

- The **leader node**  $S_0$  can only be observed by a small subset of the follower nodes
- If node  $i$  receives information from the leader, node  $i$  is said to be **pinned to the leader**. Therefore an edge  $(v_0, v_i)$  **exists** in the augmented graph  $\bar{\mathcal{G}}$  with weight  $g_i$  (pinning gain)
- The control law of each agent can only use the **local neighborhood information** of that agent, according to the graph topology (fully distributed control scheme)
- There exists at least **one directed path from the leader node to every follower node**.
- The state variables of the agents are not directly measurable ( $C \neq I$  in equation (2))  $\implies$  we need to design a Dynamic Regulator (Observer + State-feedback)



# Cooperative observer design

## Cooperative observer design for agent (node) $i$

### Objective of cooperative observer design

We want to design a device (cooperative observer/cooperative asymptotic estimator) able to provide an estimate  $\hat{x}_i$  of the state vector  $x_i$  such that

$$\lim_{t \rightarrow \infty} \hat{x}_i(t) = x_i, \forall i = 1, \dots, N \quad (3)$$

### Local output estimation error at node $i$

We define the *local output estimation error* as

$$\tilde{y}_i = y_i - \hat{y}_i \quad (4)$$

where  $\hat{y}_i = C\hat{x}_i$  is the *local output estimate*

# Cooperative observer design

## Cooperative observer design for agent (node) $i$

Neighborhood output estimation error of node  $i$

$$\xi_i = \sum_{j=1}^N a_{ij}(\tilde{y}_j - \tilde{y}_i) + g_i(\tilde{y}_0 - \tilde{y}_i) \quad (5)$$

Cooperative observer for agent (node)  $i$

$$\dot{\hat{x}}_i = A\hat{x}_i + Bu_i - cF\xi_i \quad (6)$$

- coupling gain:  $c > 0$
- observer gain:  $F \in \mathbb{R}^{n \times p}$

# Cooperative observer design

## Cooperative observer design for agent (node) $i$

### Remarks

- The state estimation algorithm considered here is *completely distributed* in the sense that each observer only requires its local output estimation error + the output estimation errors of the neighborhood agents

### Global cooperative observer dynamics

$$\dot{\hat{x}} = A_o \hat{x} + (I_N \otimes B)u + c((L + G) \otimes F)y \quad (7)$$

- $A_o = (I_N \otimes A) - c((L + G) \otimes FC)$
- $\hat{x} = \text{col}(\hat{x}_1, \hat{x}_2, \dots, \hat{x}_N) \in \mathbb{R}^{nN}$
- $y = \text{col}(y_1, y_2, \dots, y_N) \in \mathbb{R}^{pN}$
- $u = \text{col}(u_1, u_2, \dots, u_N) \in \mathbb{R}^{mN}$

# Cooperative observer design

## Analysis of the global estimation error dynamics

### Global state estimation error

$$\tilde{x}(t) = x(t) - \hat{x} \quad (8)$$

### Global state estimation error dynamics

$$\dot{\tilde{x}} = \dot{x} - \dot{\hat{x}} = A_o \tilde{x} \quad (9)$$

$$A_o = (I_N \otimes A) - c((L + G) \otimes FC) \quad (10)$$

# Cooperative observer design

## Objective and problem solution

### Objective of the cooperative observer design problem

The cooperative observer design problem is solved if

$$\lim_{t \rightarrow \infty} \tilde{x}(t) = 0 \quad (11)$$

### Cooperative observer design problem solution

The global state estimation error converges to 0 if and only if matrix

$$A_o = (I_N \otimes A) - c((L + G) \otimes F) \quad (12)$$

is *Hurwitz* (i.e., it has all the eigenvalues with strictly negative real part)

# Cooperative observer design

## Global observer eigenvalues

- The following Lemma provides useful insight about the eigenvalues of global observer

### Lemma 2 (Global observer eigenvalues)

$$\text{eig}(A_0) = \bigcup_{i=1}^N \text{eig}(A - c\lambda_i FC) \quad (13)$$

where  $\lambda_i$ ,  $i = 1, \dots, N$  are the eigenvalues of the matrix  $L + G$

- Lemma 2 can be easily proved by analyzing the structure of matrix  $A_o$  in (12)

# Cooperative observer design

## Design of observer parameter $F$ and $c$

### Theorem 2 (Global observer design)

Consider the cooperative observer in equation (6). Design the observer gain  $F$  as

$$F = PC'R^{-1} \quad (14)$$

where  $P$  is the unique positive definite solution of the algebraic Riccati equation (ARE)

$$AP + PA' + Q - PC'R^{-1}CP = 0 \quad (15)$$

Then

$$\lim_{t \rightarrow \infty} \tilde{x}(t) = 0 \quad (16)$$

if

$$c \geq \frac{1}{2 \min_{i \in \mathcal{N}} \operatorname{Re}(\lambda_i)} \quad (17)$$

# Cooperative dynamic regulator design

## Connecting the SVFB protocol to the Cooperative observer

### SVFB distributed protocol

$$u_i = cK\hat{e}_i \quad (18)$$

$$\hat{e}_i = \sum_{j=1}^N a_{ij}(\hat{x}_j - \hat{x}_i) + g_i(\hat{x}_0 - \hat{x}_i) \quad (19)$$

### Cooperative (distributed) observer

$$\dot{\hat{x}}_i = A\hat{x}_i + Bu_i - cF\xi_i \quad (20)$$

$$\xi_i = \sum_{j=1}^N a_{ij}(\tilde{y}_j - \tilde{y}_i) + g_i(\tilde{y}_0 - \tilde{y}_i) \quad (21)$$



# Cooperative dynamic regulator design

## Global dynamic control protocol equations

Local dynamic controller of agent (node)  $i$

$$u_i = cK\hat{\epsilon}_i \quad (22)$$

$$\dot{\hat{x}}_i = A\hat{x}_i + Bu_i - cF\xi_i \quad (23)$$

Local closed-loop dynamics for agent (node)  $i$

$$\dot{x}_i = Ax_i + cBK \left( \sum_{j=1}^N a_{ij}(\hat{x}_j - \hat{x}_i) + g_i(\hat{x}_0 - \hat{x}_i) \right) \quad (24)$$

$$\dot{\hat{x}}_i = A\hat{x}_i + Bu_i - cF \left( \sum_{j=1}^N a_{ij}(\tilde{y}_j - \tilde{y}_i) + g_i(\tilde{y}_0 - \tilde{y}_i) \right) \quad (25)$$

### Theorem 3

The global closed-loop dynamics obtained by applying the cooperative dynamics regulator is described by the following equation:

$$\begin{bmatrix} \dot{\delta} \\ \dot{\tilde{x}} \end{bmatrix} = \begin{bmatrix} A_c & B_c \\ 0 & A_o \end{bmatrix} \begin{bmatrix} \delta \\ \tilde{x} \end{bmatrix} \quad (26)$$

# Cooperative dynamic regulator design

## Separation principle

### Corollary (Separation principles)

Theorem 3 tell us that:

$$\dot{\delta} = A_c \delta \quad (27)$$

global disagreement error dynamics only depends on  $c$  and  $K$  no matter if the state variables are directly available or not

$$\dot{\tilde{x}} = A_o \tilde{x} \quad (28)$$

global estimation error dynamics only depends on  $c$  and  $F$  no matter how you design the SVFB protocol

# Cooperative SVFB protocol + local observes

## Agent controller with local observer

Local dynamic controller of agent (node)  $i$

$$u_i = cK\hat{e}_i \quad (29)$$

$$\dot{\hat{x}}_i = A\hat{x}_i + Bu_i - cF\tilde{y}_i \quad (30)$$

# Cooperative SVFB protocol + local observers

## Global closed-loop dynamics

A possible alternative approach is to design

### Theorem 4

The global closed-loop dynamics obtained by applying the cooperative SVFB protocol with local observers is described by the following equation:

$$\begin{bmatrix} \dot{\delta} \\ \dot{\tilde{x}} \end{bmatrix} = \begin{bmatrix} A_c & B_c \\ 0 & I \otimes (A + cFC) \end{bmatrix} \begin{bmatrix} \delta \\ \tilde{x} \end{bmatrix} \quad (31)$$

# Local observer design

## Local observer dynamics

- The following Lemma provides useful insight about the eigenvalues of global observer

### Lemma 3 (Local observer dynamics)

$$\text{eig}(I \otimes (A + cFC)) = \bigcup_{i=1}^N \text{eig}(A + cFC) \quad (32)$$

- Lemma 3 shows that in order to drive the state estimation error  $\tilde{x}$  to 0 asymptotically we have just to design  $F$  such that  $(A + cFC)$  is Hurwitz.