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# Rigidity Theory for Multi-Robot Coordination

**Daniel Zelazo**

Faculty of Aerospace Engineering  
Technion-Israel Institute of Technology

IAAC workshop on “Motion Control Methods in Robotics”



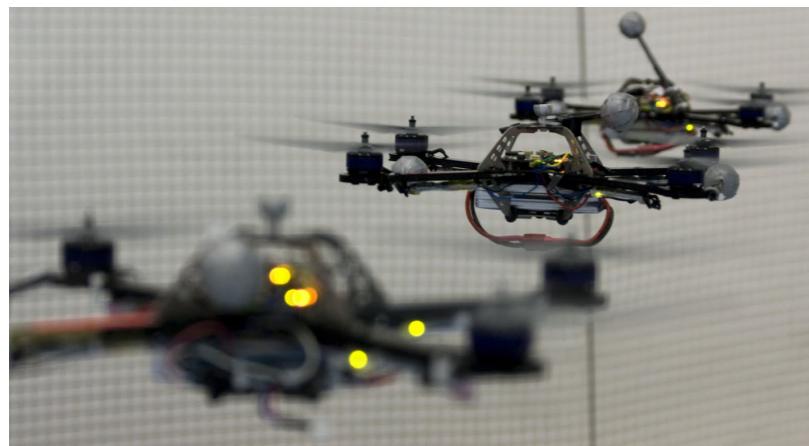
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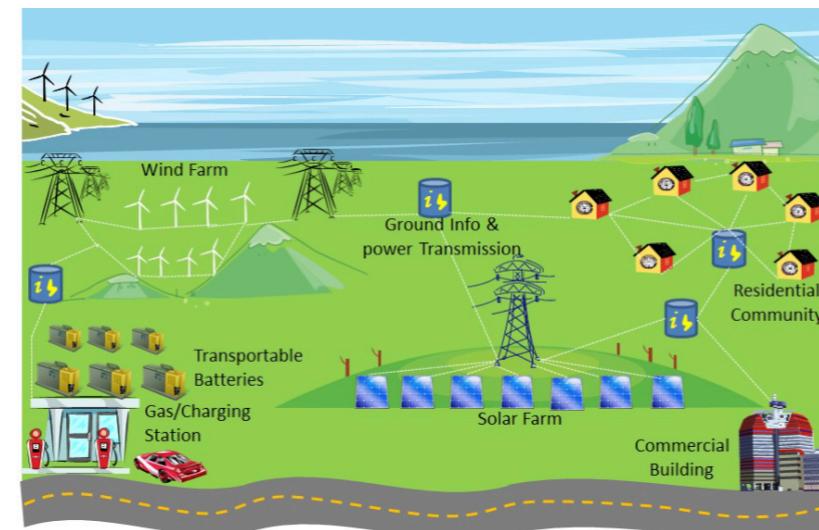
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# Multi-Agent Systems

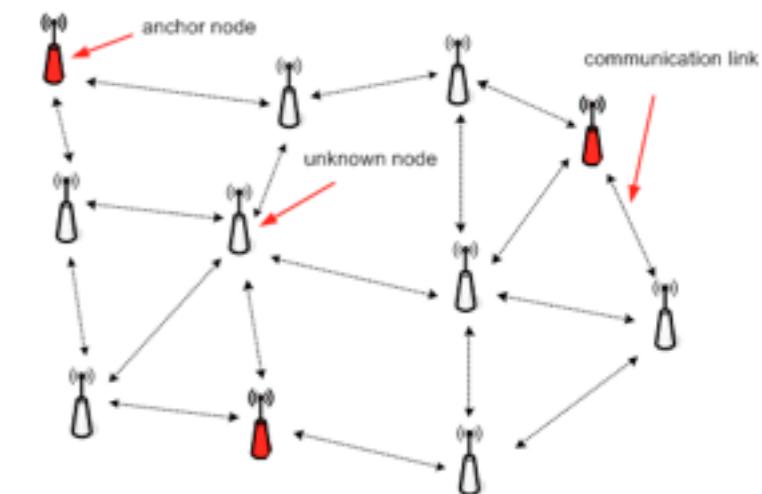
**Multi-Agent Systems** are systems composed of multiple interacting dynamic units.



formation control  
& multi-robot coordination



energy management &  
the “smart-grid”



sensor networks



# Challenges in Multi-Robot Systems



## Sensing

- GPS
- Relative Position Sensing
- Range Sensing
- Bearing Sensing

## Communication

- Internet
- Radio
- Sonar
- MANet

Solutions to coordination problems in multi-robot systems are *highly* dependent on the sensing and communication mediums available!

selection criteria depends on mission requirements, cost, environment...



# Challenges in Multi-Robot Systems



Solutions to coordination problems in multi-robot systems are *highly* dependent on the sensing and communication mediums available!

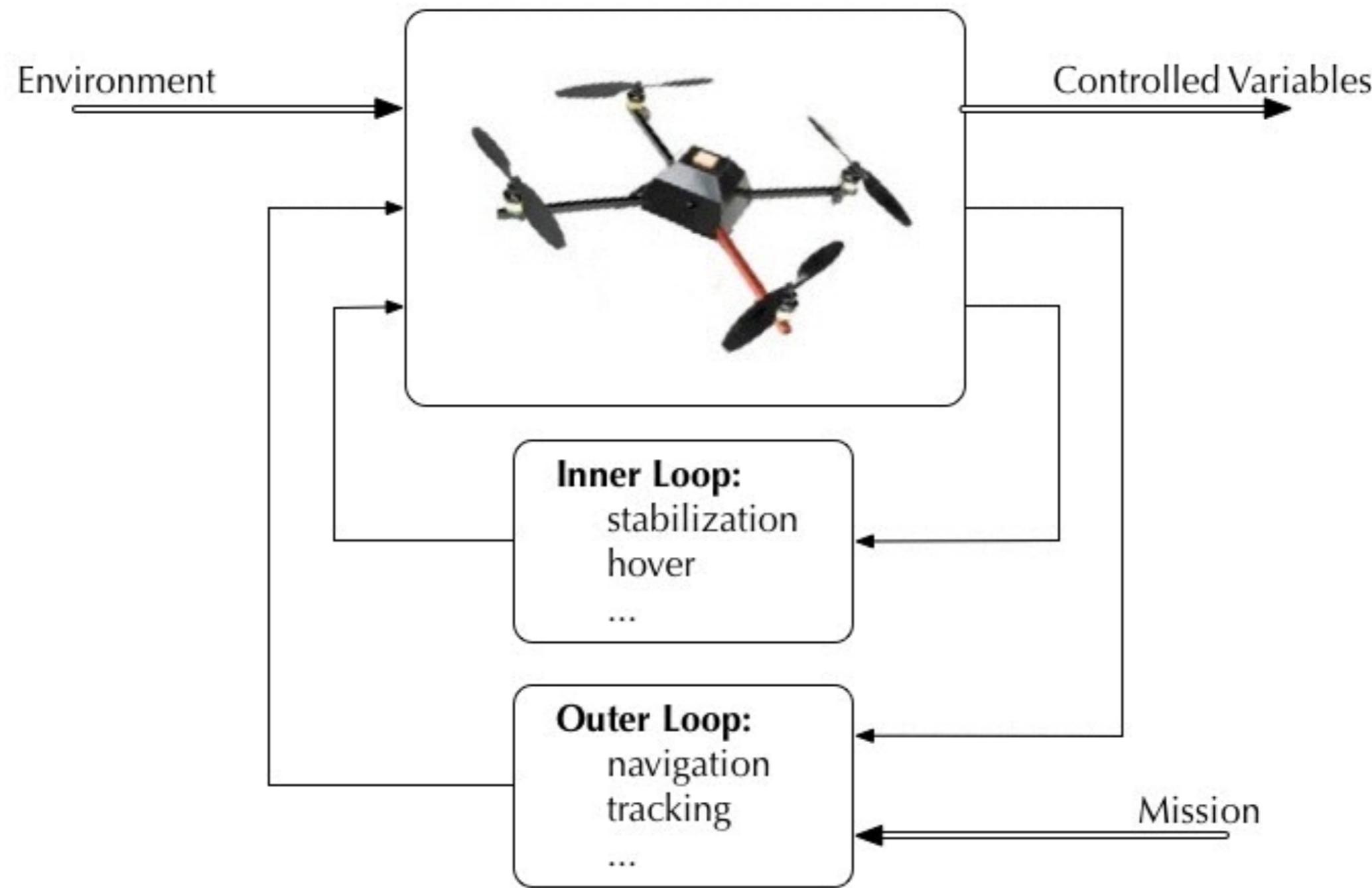
selection criteria depends on mission requirements, cost, environment...

Are there *architectural features* of a multi-agent system that are independent of any particular mission or hardware capabilities?



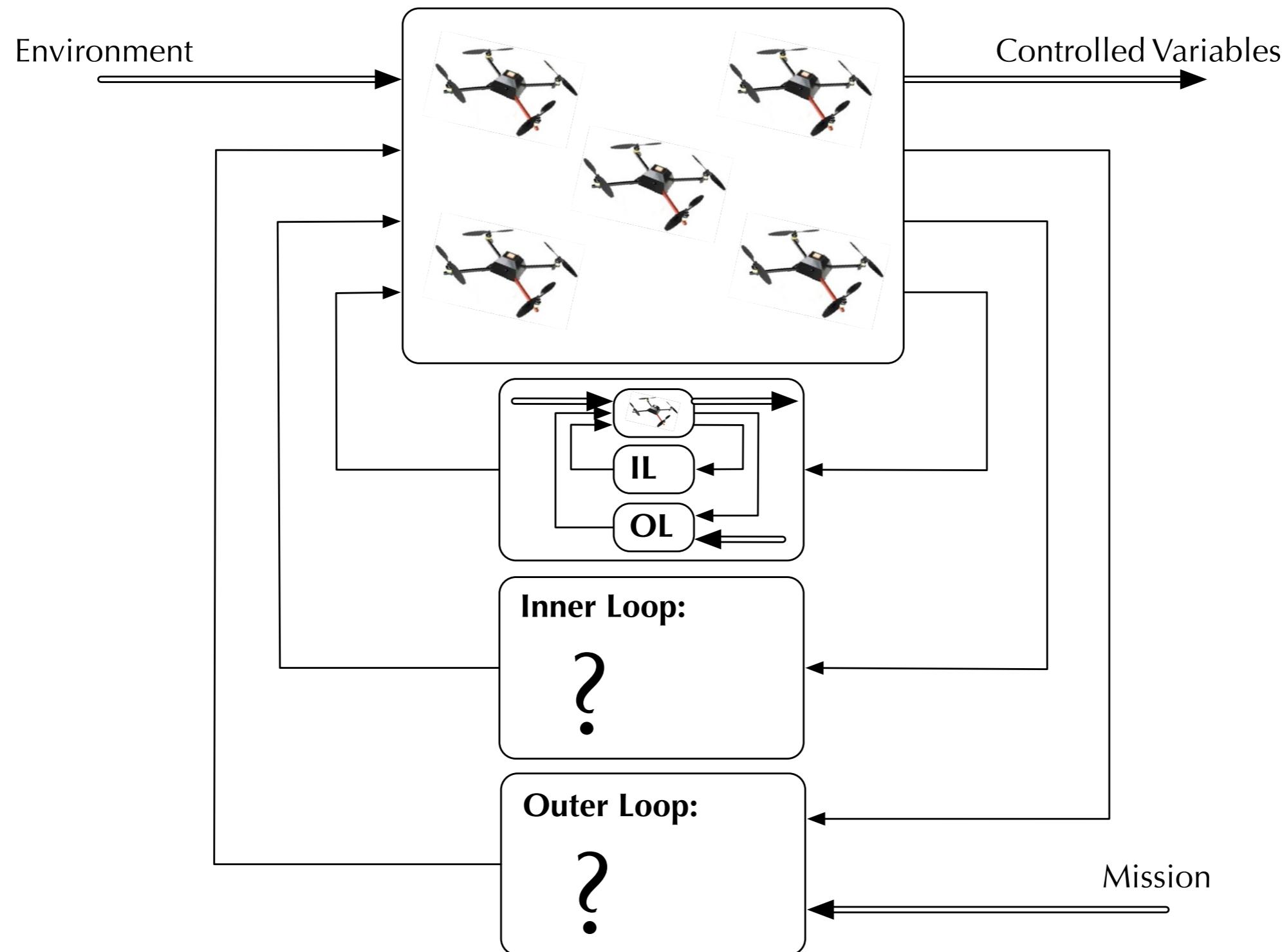
# Towards a Multi-Robot Control Architecture

control architecture for a *single* quadrotor



# Towards a Multi-Robot Control Architecture

what is the architecture for a *multi-robot* system?

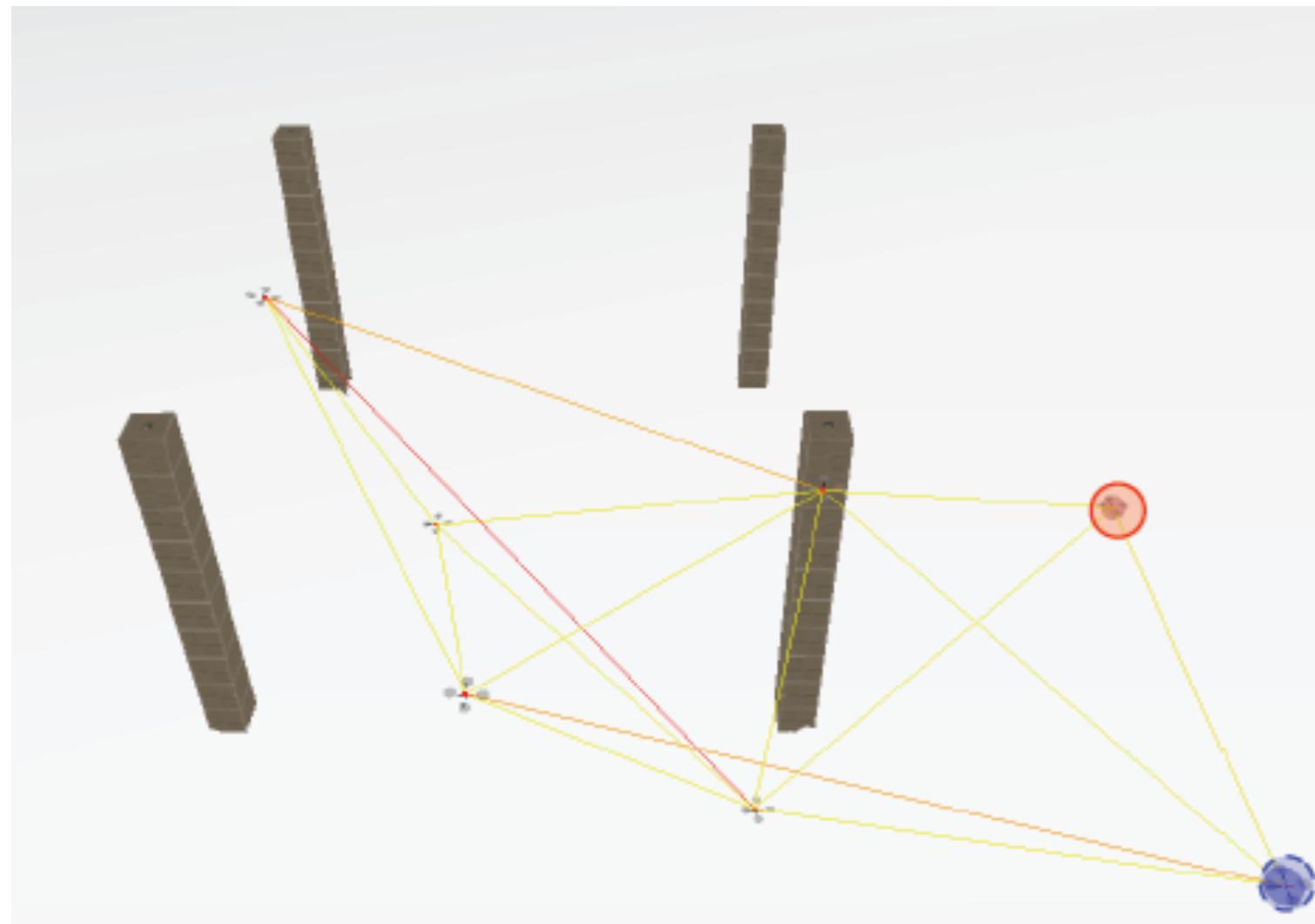


# Towards a Multi-Robot Control Architecture

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what is the architecture for a *multi-robot* system?

## Connectivity



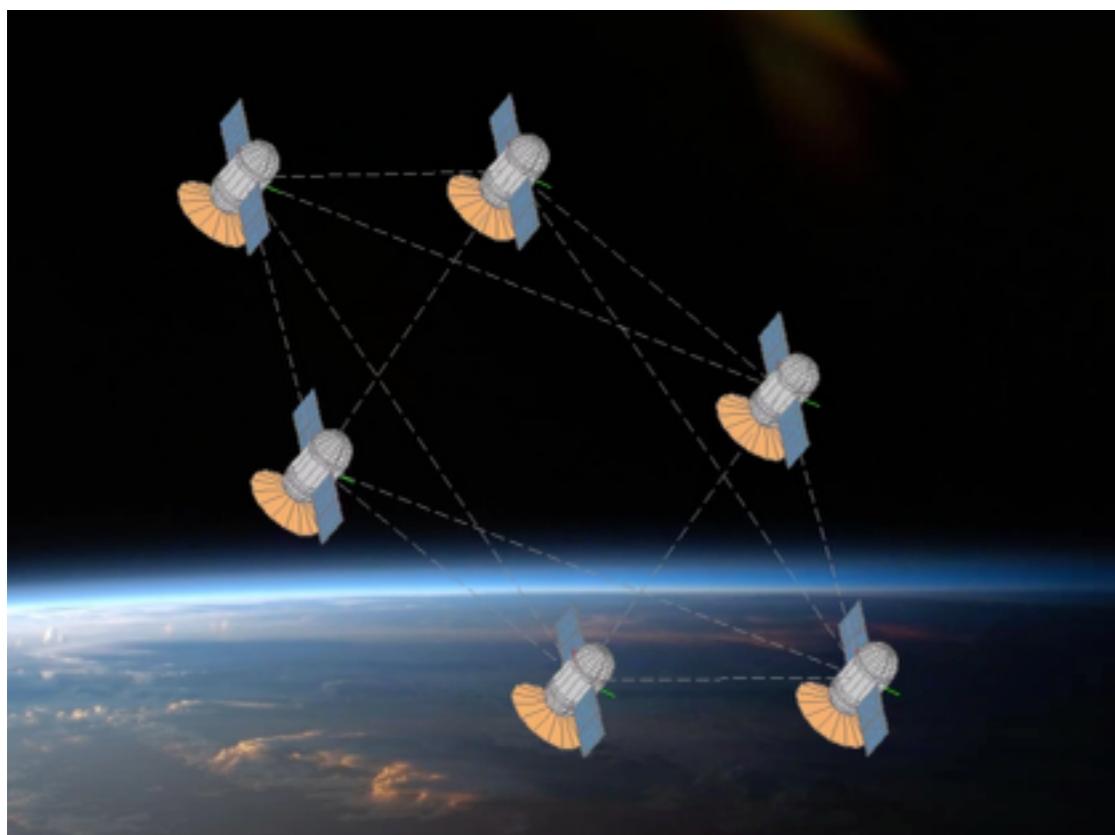
Ji and Egerstedt, 2007  
Dimarogonas and Kyriakopoulos, 2008  
Yang *et al.*, 2010  
Robuffo Giordano *et al.*, 2013



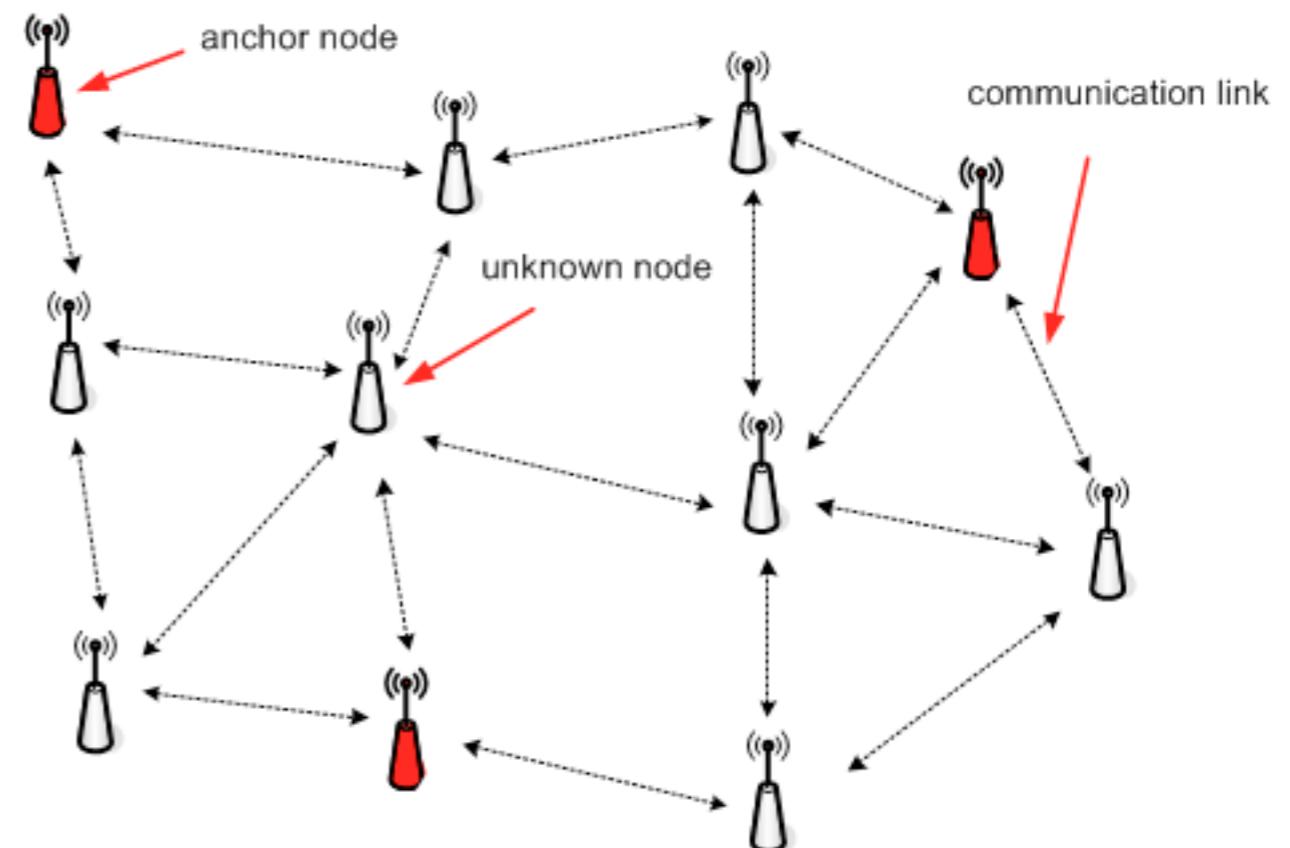
# Towards a Multi-Robot Control Architecture

is connectivity enough for higher-level objectives?

## formation control



## localization



<http://www.commsys.isy.liu.se/en/research>

**Rigidity Theory** provides the correct framework to address many multi-agent mission objectives



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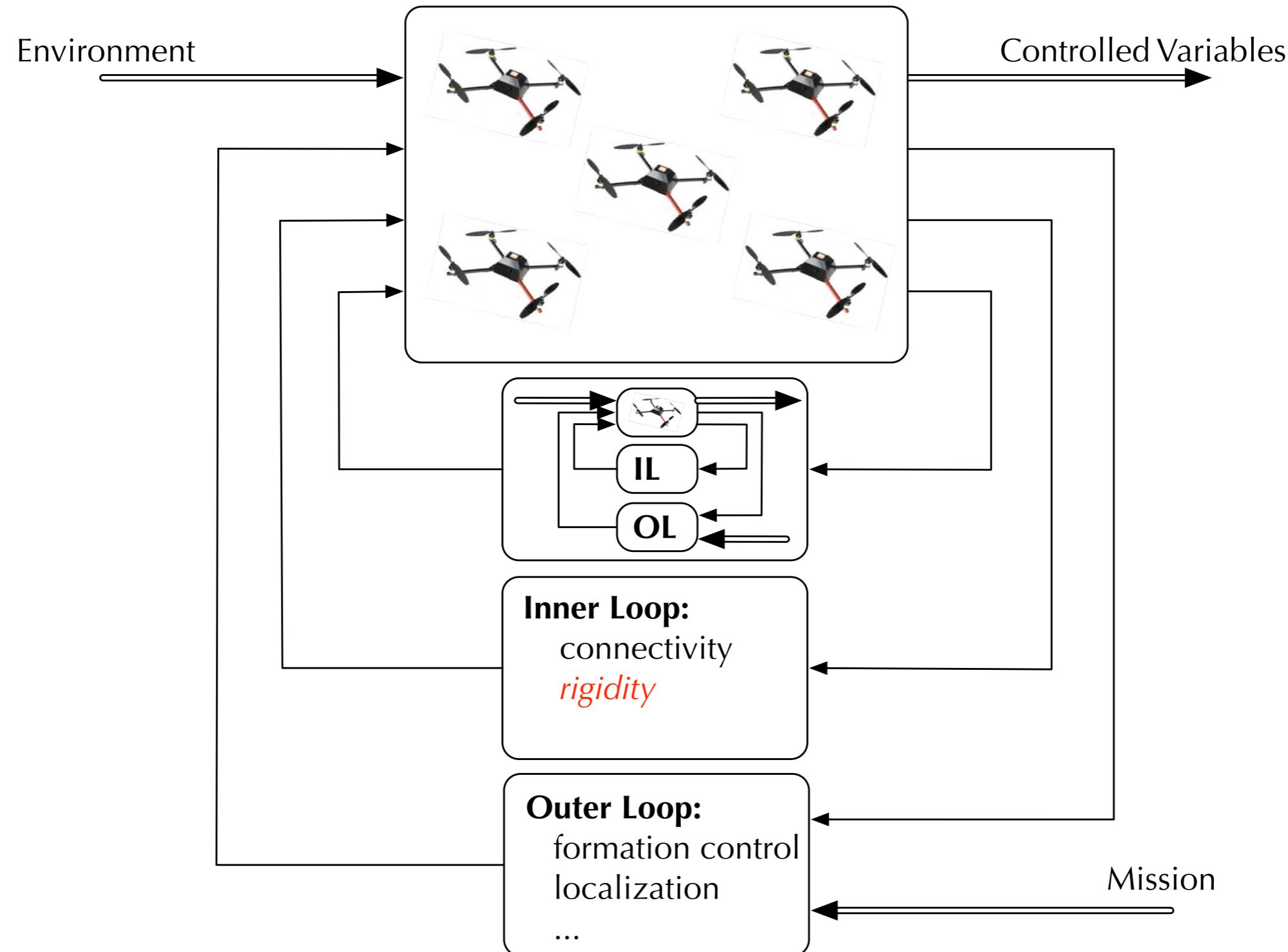
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# Towards a Multi-Robot Control Architecture

what is the architecture for a *multi-robot* system?



# Rigidity Theory

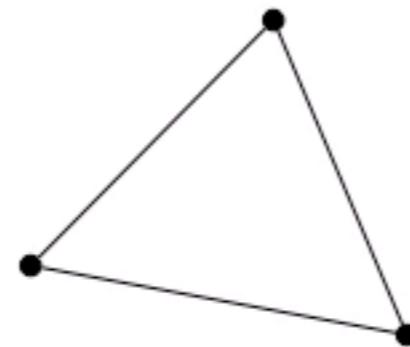
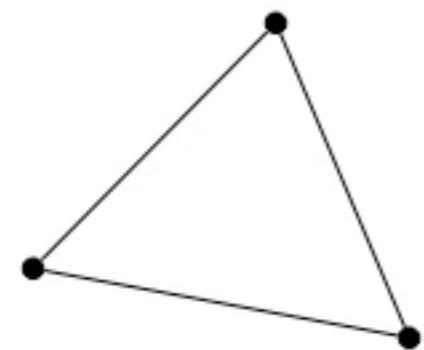
**Rigidity** is a combinatorial theory for characterizing the “stiffness” or “flexibility” of structures formed by rigid bodies connected by flexible linkages or hinges.

## Distance Rigidity

- maintain distance pairs
- rigid body rotations and translations

## Bearing (Parallel) Rigidity

- maintain angles (shape)
- rigid body translations and dilations

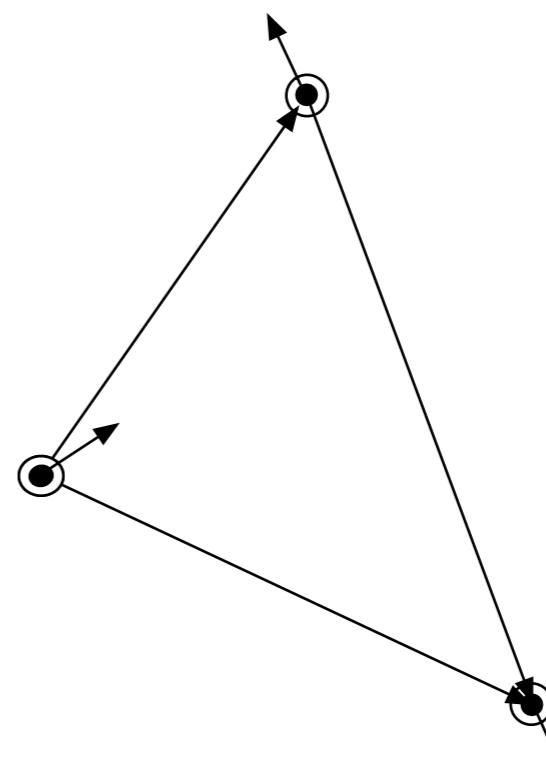
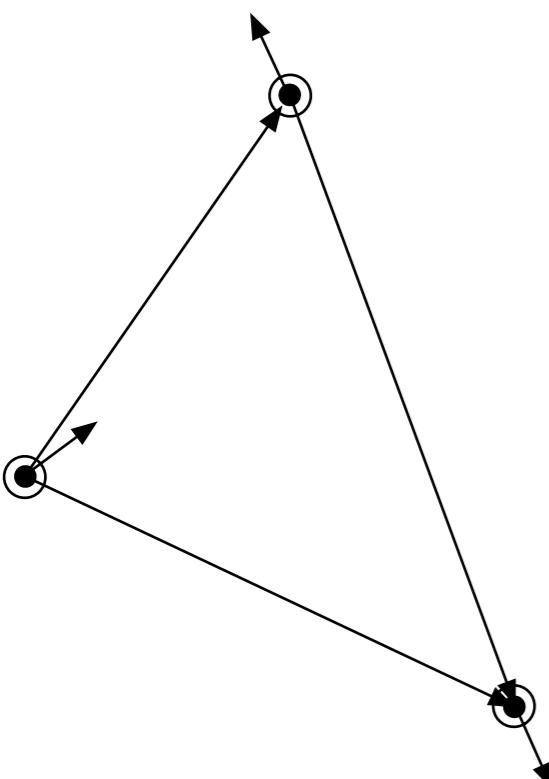


# Infinitesimal Motions in SE(2)

**Rigidity** is a combinatorial theory for characterizing the “stiffness” or “flexibility” of structures formed by rigid bodies connected by flexible linkages or hinges.

## SE(2) Rigidity

- maintain bearings in *local* frame
- rigid body rotations and translations + coordinated rotations



# Rigidity Theory

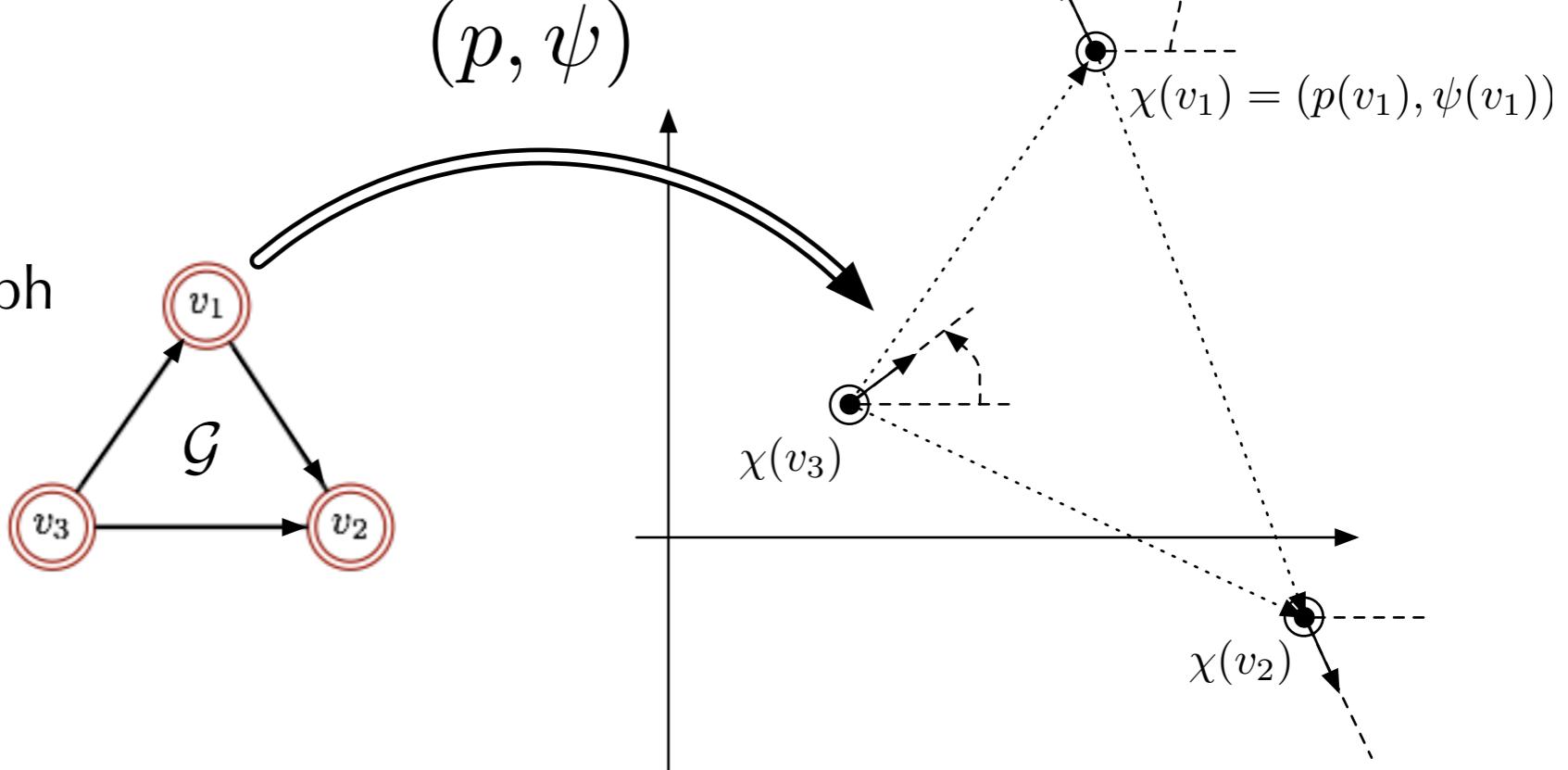
bar-and-joint frameworks in  $\text{SE}(2)$

$$(\mathcal{G}, p, \psi)$$

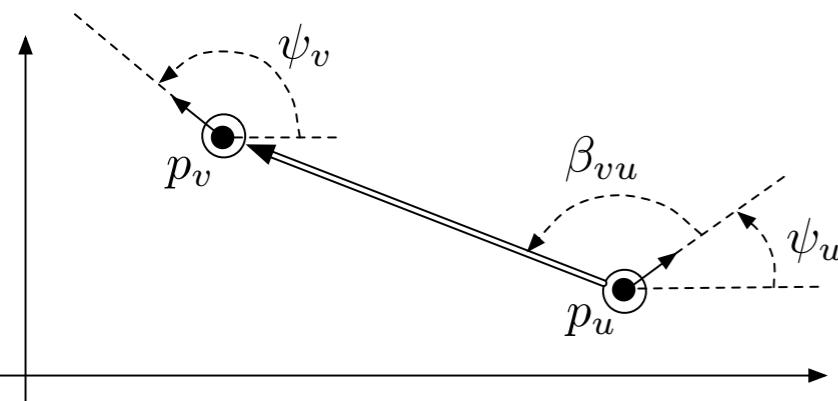
$\mathcal{G} = (\mathcal{V}, \mathcal{E})$  a *directed* graph

$$p : \mathcal{V} \rightarrow \mathbb{R}^2$$

$$\psi : \mathcal{V} \rightarrow \mathcal{S}^1$$



a directed edge indicates availability  
of relative bearing measurement



stacked vector of entire framework

$$\chi_p = p(\mathcal{V}) \in \mathbb{R}^{2|\mathcal{V}|}$$

$$\chi_\psi = \psi(\mathcal{V}) \in \mathcal{S}^{1|\mathcal{V}|}$$



# Rigidity Theory

A framework is **infinitesimally rigid** if all the infinitesimal motions are *trivial* (i.e., translations, rotations, scalings, coordinated rotations).

## Distance Rigidity

Rigidity Matrix

$$R(p)\xi = 0$$

## Bearing Rigidity

Bearing Rigidity Matrix

$$R_{\parallel}(p)\xi = 0$$

## SE(2) Rigidity

SE(2) Rigidity Matrix

$$\underbrace{\begin{bmatrix} D_{\mathcal{G}}^{-1}(\chi_p)R_{\parallel}(\chi_p) & \overline{E}(\mathcal{G}) \end{bmatrix}}_{\mathcal{B}_{\mathcal{G}}(\chi(\mathcal{V}))}\zeta = 0$$

## Theorem

A framework is infinitesimally (distance, parallel) rigid if and only if the rank of the rigidity matrix is  $2|\mathcal{V}| - 3$

A framework is SE(2) infinitesimally rigid if and only if the rank of the rigidity matrix is  $3|\mathcal{V}| - 4$



# Distance and Bearing Rigidity

## Theorem

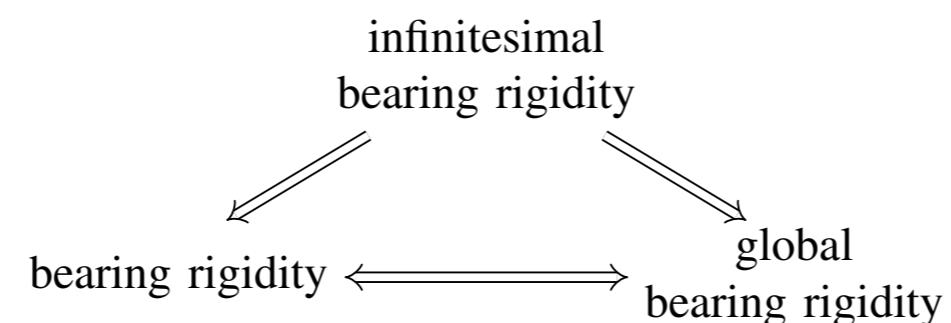
In the plane, a framework is infinitesimally rigid if and only if it is infinitesimally bearing rigid

- does *not* hold for higher dimensions

## Theorem

Infinitesimal bearing rigidity implies global bearing rigidity.

- such a relationship does *not* hold in distance rigidity

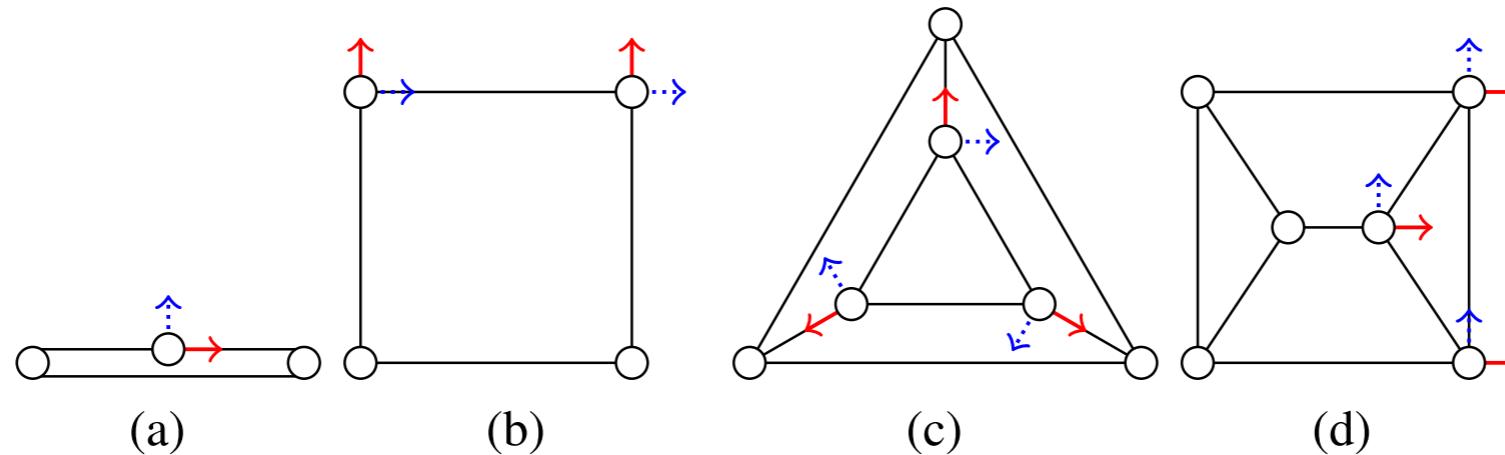


[Zhao and Zelazo, TAC2015]

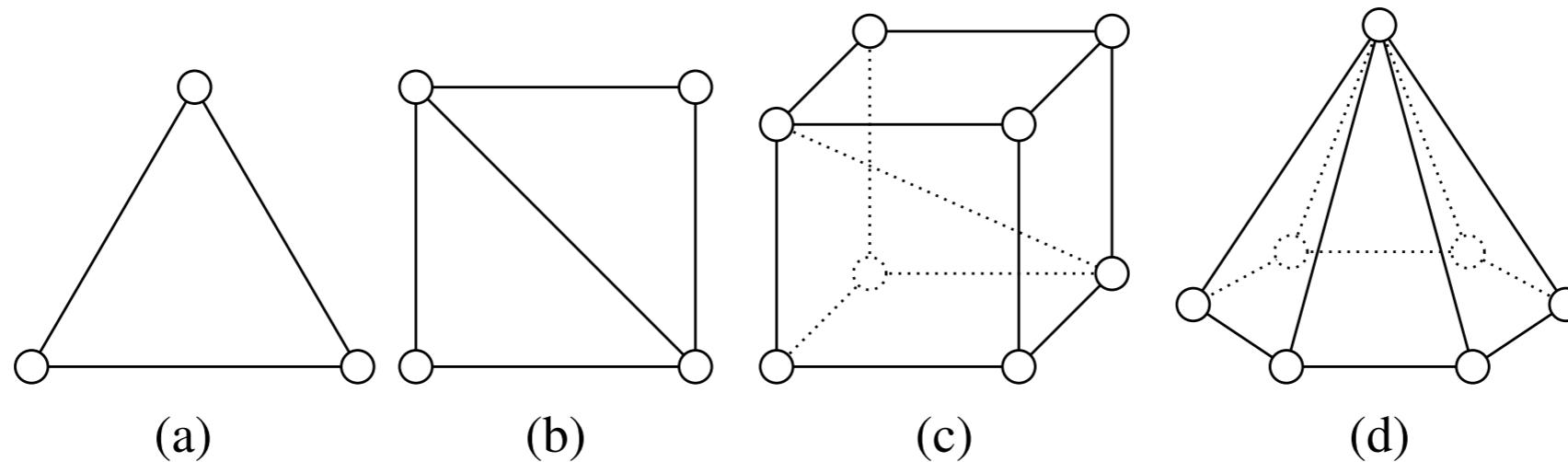


# Distance and Bearing Rigidity

non-infinitesimally bearing rigid



infinitesimally bearing rigid



[Zhao and Zelazo, TAC2015]



# Formation Control

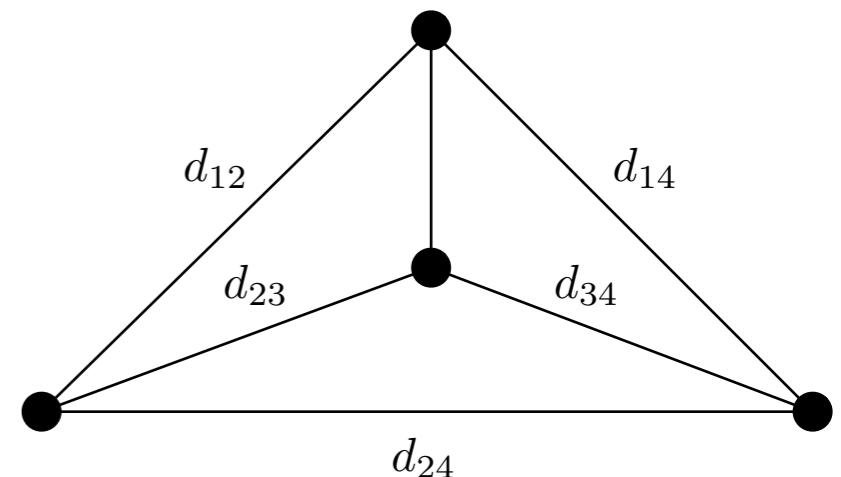
The **formation control** problem is to design a (distributed) control law that drives the agents to a desired spatial configuration determined by interagent distances or bearings.

## Gradient Dynamical Systems

$$\dot{p} = -\nabla F(p)$$

distance-based formation control

$$F(p) = \frac{1}{4} \sum_{ij \in \mathcal{E}} (\|p_i - p_j\|^2 - d_{ij}^2)^2$$



# Formation Control

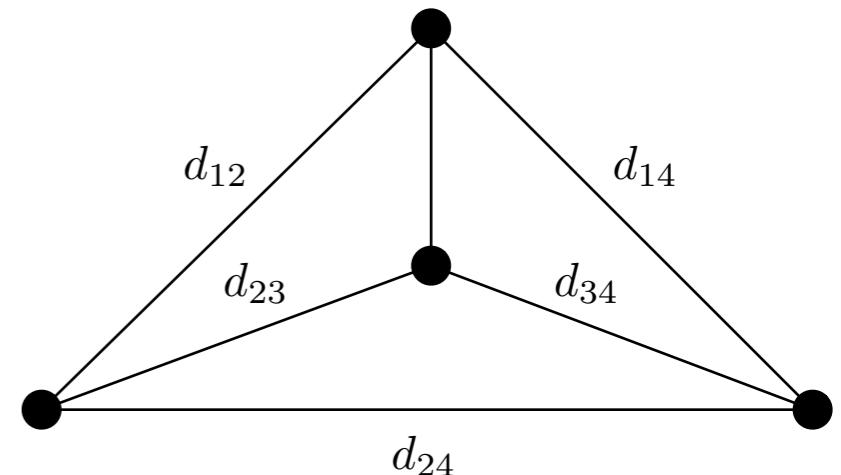
The **formation control** problem is to design a (distributed) control law that drives the agents to a desired spatial configuration determined by interagent distances or bearings.

## Gradient Dynamical Systems

$$\dot{p} = -\nabla F(p)$$

distance-based formation control

$$\dot{p} = -R(p)^T(R(p) - d^2)$$



# Formation Control

The **formation control** problem is to design a (distributed) control law that drives the agents to a desired spatial configuration determined by interagent distances or bearings.

## Distance Rigidity

distance formation control

$$\dot{p}_i = \sum_{j \sim i} (\|p_i - p_j\|^2 - d_{ij}^2) (p_j - p_i)$$

- control requires distances and relative positions
- distance-only control requires estimation of relative positions

## Bearing Rigidity

bearing formation control

$$\dot{p}_i = - \sum_{j \sim i} \frac{1}{\|p_i - p_j\|} \left( I_2 - \frac{(p_j - p_i)(p_j - p_i)^T}{\|p_i - p_j\|^2} \right) g_{ij}^*$$

- control requires bearings and distances

[Krick2007, Anderson2008, Dimarogonas2008, Dörfler2010]

[Zhao and Zelazo, TAC2015]



# A Bearing-Only Formation Controller

bearing formation control

$$\dot{p}_i = - \sum_{j \sim i} \frac{1}{\|p_i - p_j\|} \left( I_2 - \frac{(p_j - p_i)(p_j - p_i)^T}{\|p_i - p_j\|^2} \right) g_{ij}^*$$

- requires distance measurements
- orthogonal projection operator

a bearing-only approach

$$\dot{p}_i(t) = - \sum_{j \sim i} P_{g_{ij}(t)} g_{ij}^*$$

stability analysis depends on the **rigidity** of the formation!

- almost-global stability exponential stability
- centroid and scale invariance
- works for arbitrary dimension
- collision avoidance

[Zhao and Zelazo, TAC2015]



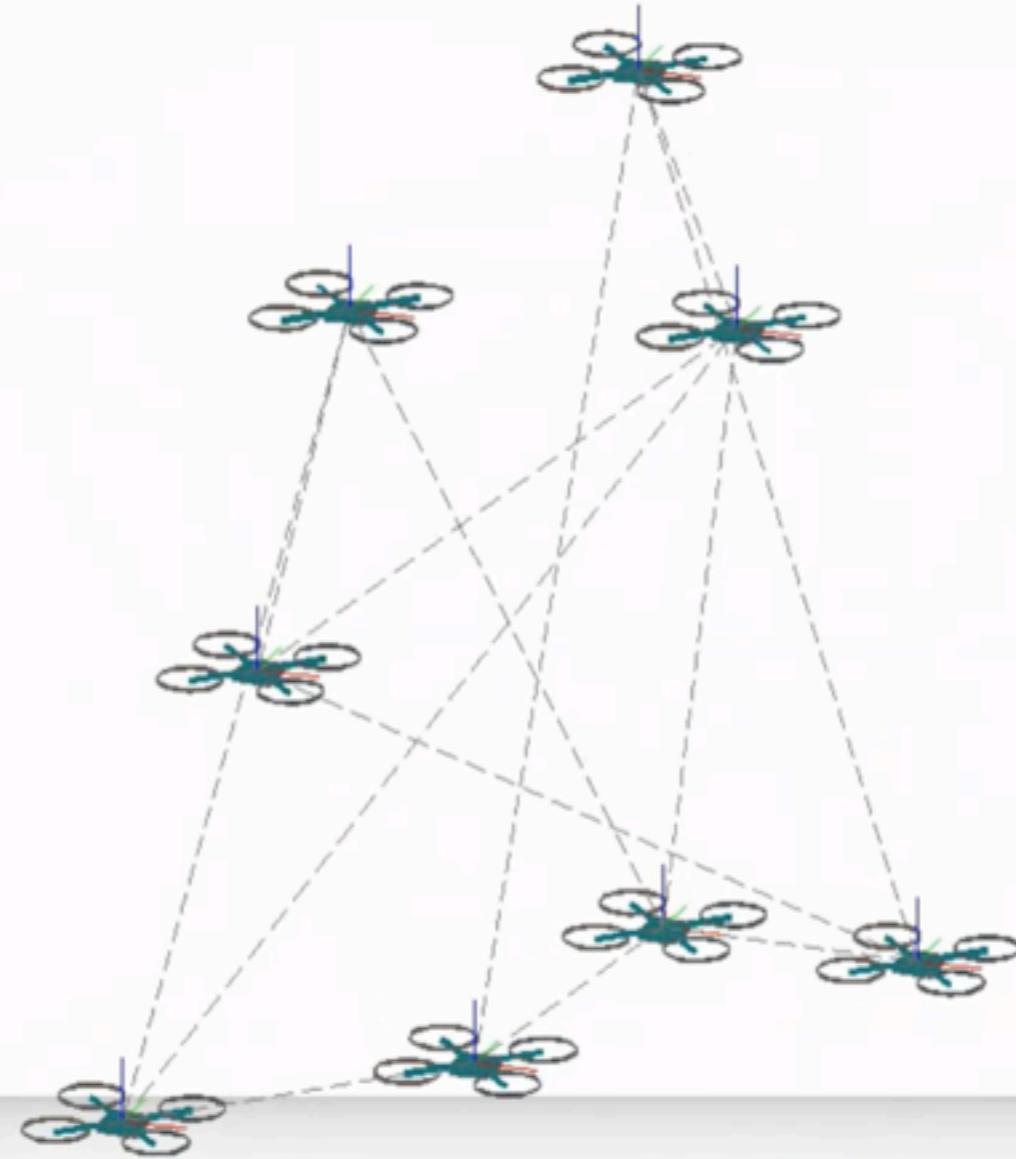
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# Formation Control: Bearing-Constrained Formations



**S. Zhao and D. Zelazo, "Bearing rigidity and almost global bearing-only formation stabilization," IEEE Transactions on Automatic Control, 2015**



# Formation Control

The **formation control** problem is to design a (distributed) control law that drives the agents to a desired spatial configuration determined by interagent distances or bearings.

## SE(2) Bearing Rigidity

$$\begin{bmatrix} \dot{p}_i \\ \dot{\psi}_i \end{bmatrix} = \begin{bmatrix} -\sum_{(i,j) \in \mathcal{E}} \frac{P_{r_{ij}}}{\|p_i - p_j\|} r_{ij}^d + \sum_{(j,i) \in \mathcal{E}} T(\psi_j - \psi_i) \frac{P_{r_{ji}}}{\|p_i - p_j\|} r_{ji}^d \\ -\sum_{(i,j) \in \mathcal{E}} (r_{ij}^\perp)^T r_{ij}^d \end{bmatrix}$$

- requires communication
- requires relative orientation

## a scale-free SE(2) bearing approach

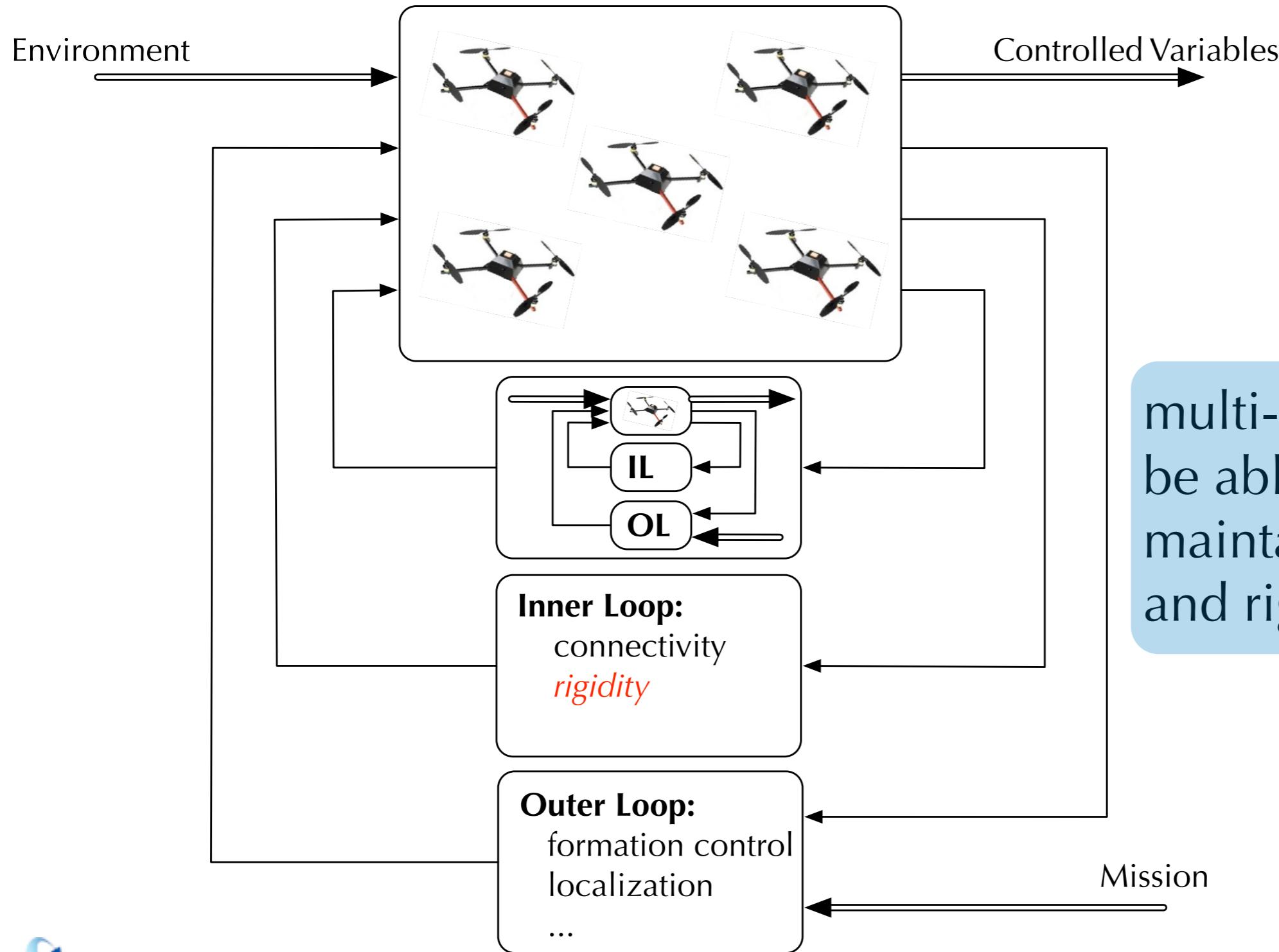
$$\begin{bmatrix} \dot{p} \\ \dot{\psi} \end{bmatrix} = \hat{\mathcal{B}}_{\mathcal{G}}(\chi)^T \mathbf{b}_{\mathcal{G}}^d$$

[Zelazo, Franchi, Robuffo-Giordano, CDC2015  
Schiano, Franchi, Zelazo, Robuffo-Giordano, ICRA2016]



# Towards a Multi-Robot Control Architecture

what is the architecture for a *multi-robot* system?



multi-robot systems must  
be able to *dynamically*  
maintain the connectivity  
and rigidity of the team



# Rigidity Maintenance

## Theorem

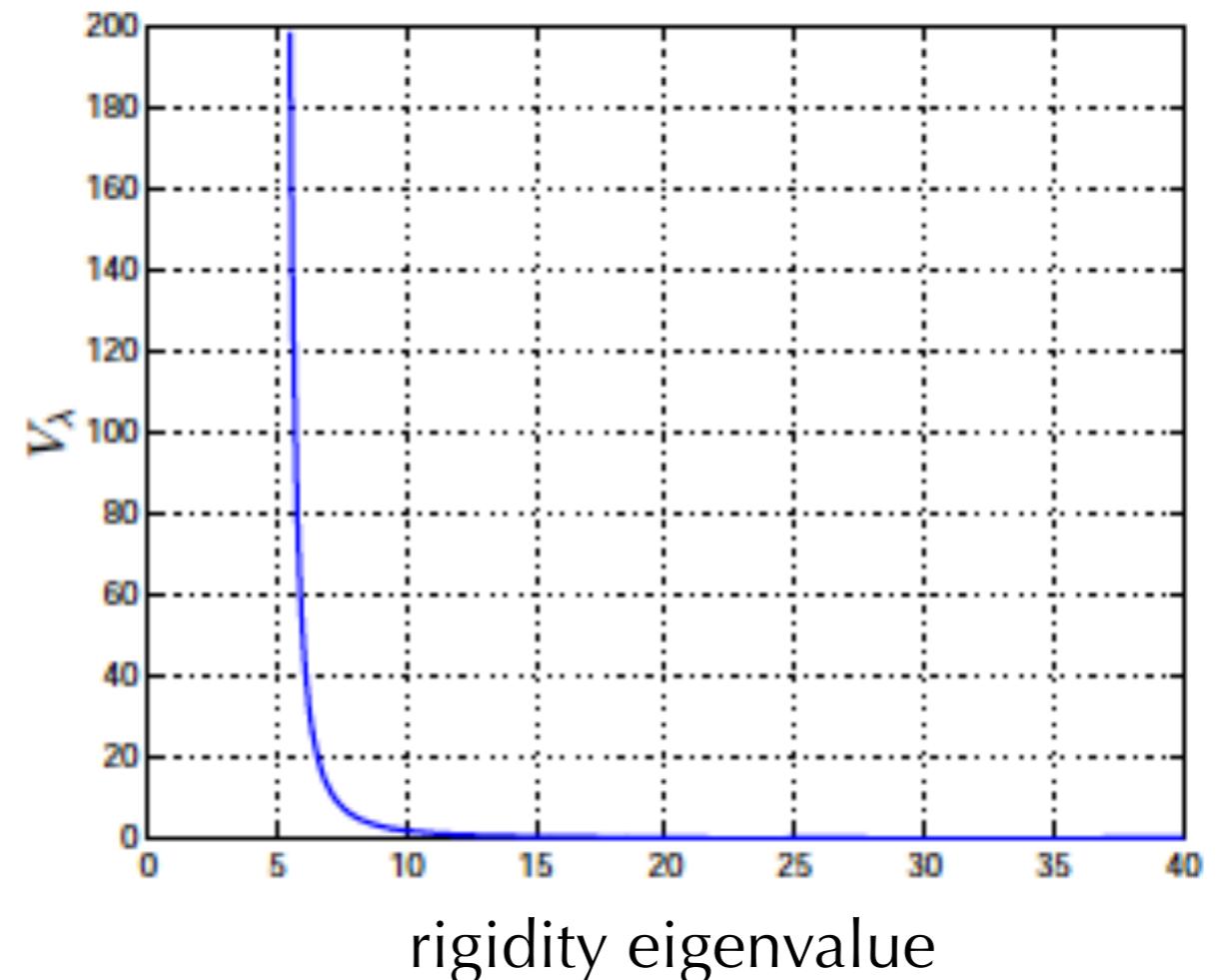
A framework is infinitesimally (distance, parallel) rigid if and only if the *rigidity eigenvalue* is strictly positive.

$$\mathcal{R} = R(p)^T R(p) \quad \mathcal{N}(\mathcal{R}) = \{\text{trivial infinitesimal motions}\}$$

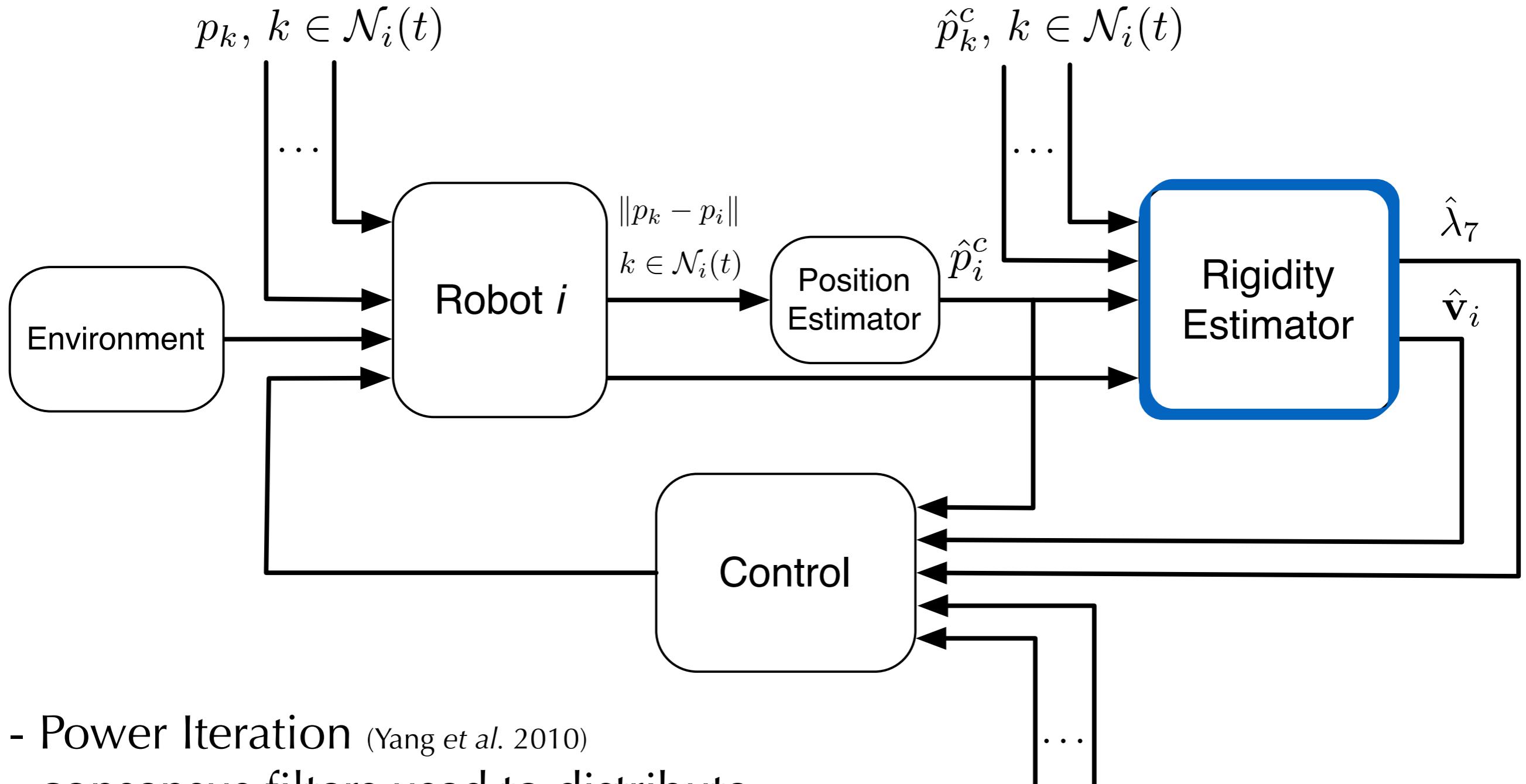
## Rigidity Maintenance

Design a control law to minimize a scalar potential function related to the rigidity eigenvalue

$$\xi_i = -\frac{\partial V_\lambda}{\partial \lambda_4} \left( \frac{\partial \lambda_4}{\partial p_i} \right)$$



# Rigidity Maintenance



- Power Iteration (Yang *et al.* 2010)
- consensus filters used to distribute computation

$\hat{\mathbf{v}}_k, k \in \mathcal{N}_i(t)$

[Zelazo, Franchi, Robuffo-Giordano, IJRR2015]

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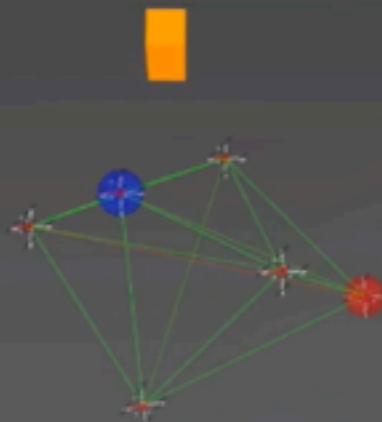


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# Rigidity Maintenance

Top view



Decentralized Rigidity Maintenance Control with Range-only Measurements for Multi-Robot Systems

Daniel Zelazo,  
Technion, Israel

Antonio Franchi and Heinrich H. Bülfhoff,  
Max Planck Institute for Biological Cybernetics, Germany

Paolo Robuffo Giordano,  
CNRS at Irisa, France

6 robots in total: 5 real + 1 simulated

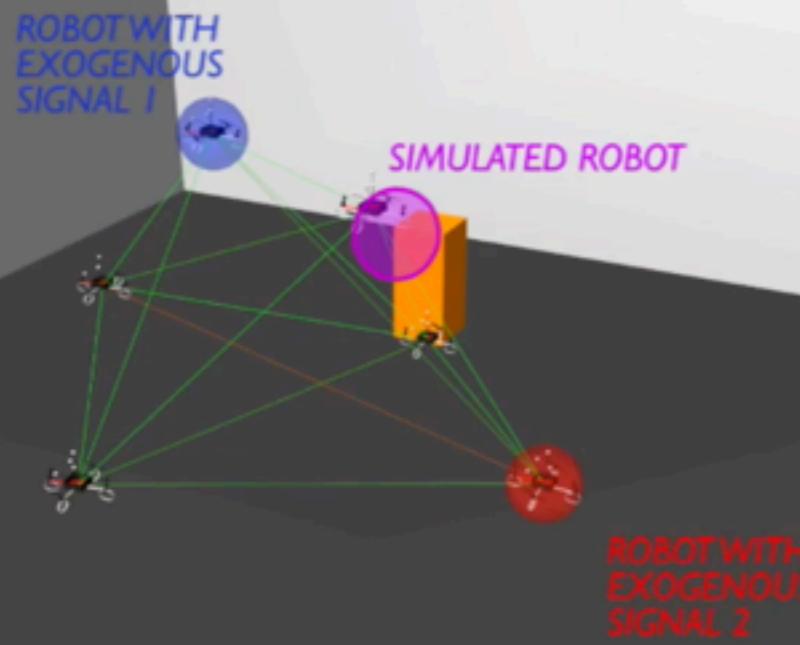
Circled robots: Maintain rigidity while tracking an exogenous command  
Other robots: Maintain rigidity

Link colors:

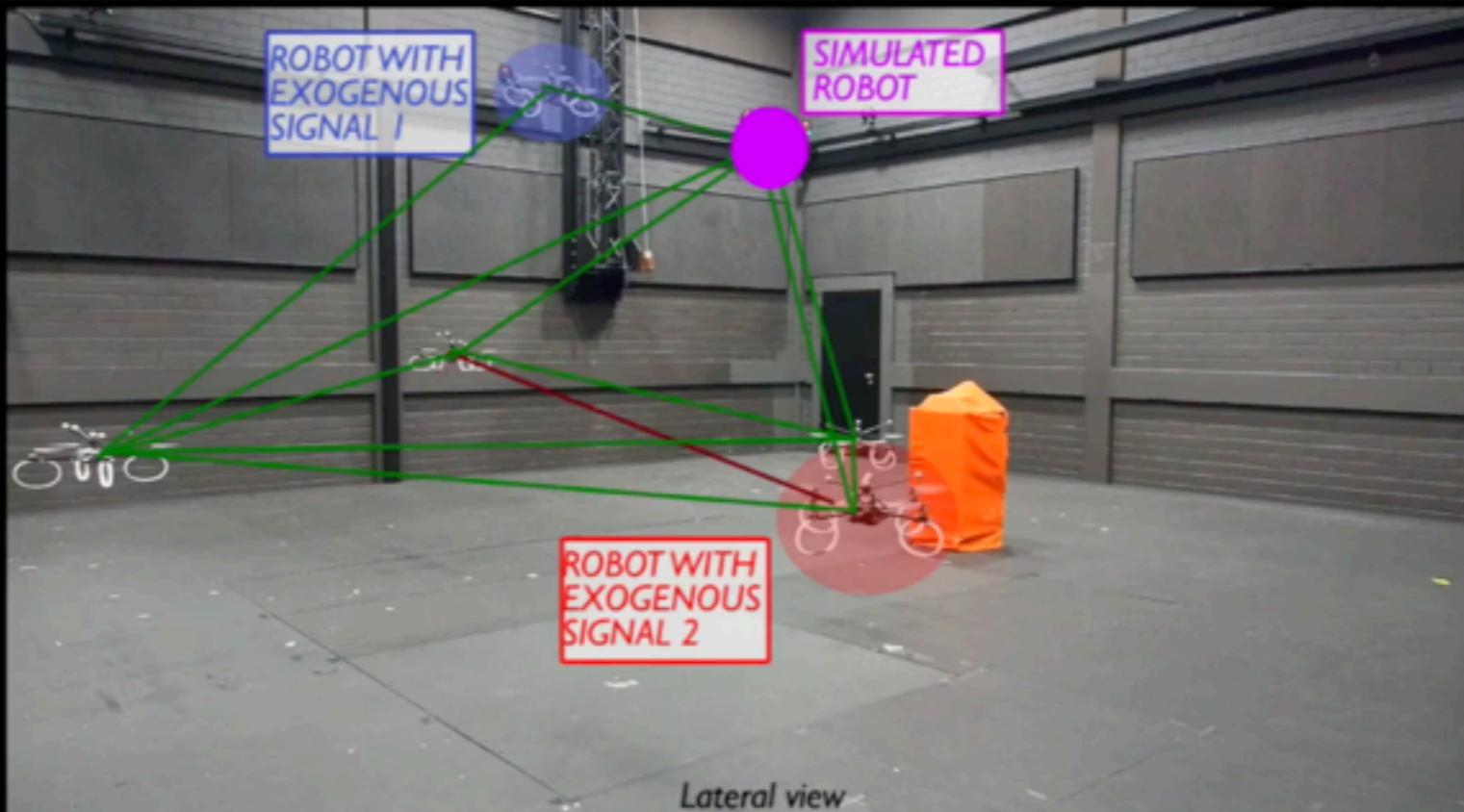
almost  
disconnected

optimally  
connected

Distributed Estimates of the  
Rigidity Eigenvalue (rigidity metrics)



Lateral view



Lateral view



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# Conclusions and Outlook

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- coordination methods for multi-agent systems depend on sensing and communication mediums
- *rigidity theory* is a powerful framework for handling high-level multi-agent objectives under different sensing and communication constraints
- *rigidity maintenance* is an important “inner-loop” for multi-robot systems



# Acknowledgements

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Dr. Shiyu Zhao



Dr. Paolo Robuffo Giordano



Dr. Antonio Franchi

## Questions?



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