
Facets of synchronization: discontinuous coupling and the minimax flow problem

by

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Outline

- Will discuss work in [1, 2, 3, 4].
- 1. **Tool to achieve synchronization:** Discontinuous coupling to synchronize piecewise-smooth systems.
- 2. **Application of synchronization:** Sync. used to solve minimax flow problem in flow networks.



[1] M. Coraggio, P. De Lellis, S. J. Hogan, M. di Bernardo, "Synchronization of networks of piecewise-smooth systems", IEEE Control System Letters, 2018

[2] M. Coraggio, P. De Lellis, M. di Bernardo, "Convergence and synchronization in networks of piecewise-smooth systems via distributed discontinuous coupling", Automatica, 2022

[3] M. Coraggio, P. De Lellis, M. di Bernardo, "Distributed discontinuous coupling for convergence in heterogeneous networks", IEEE Control System Letters, 2020

[4] M. Coraggio, S. Jafarpour, F. Bullo, M. di Bernardo, "Minimax flow over acyclic networks: distributed algorithms and microgrid application", IEEE Transactions on Control of Network Systems, 2022



Mario di Bernardo



Pietro De Lellis



Francesco Bullo



John Hogan



Saber Jafarpour

1

Synchronization of
piecewise-smooth
systems

Introduction to the problem

- Sync. appears in many natural and engineered systems.



- In some cases, it is desired, in others not. Hence, it's crucial to understand when and how it occurs.
- Often studied with *master stability fun.* [1], *Lyapunov fun.* [5].



[1] L. M. Pecora, T. L. Carroll, "Master stability functions for synchronized coupled systems," Phys. Rev. Lett., 1998

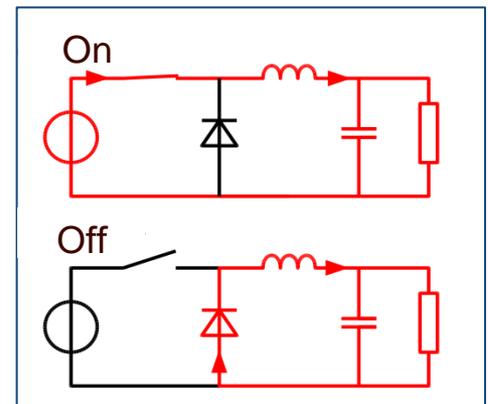
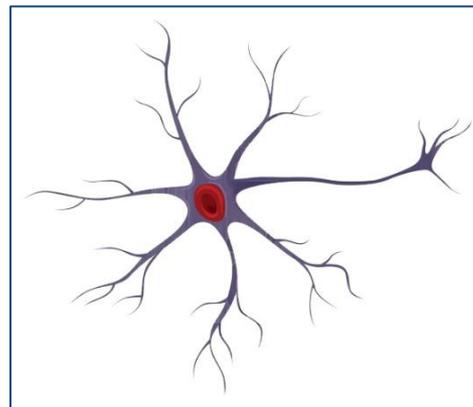
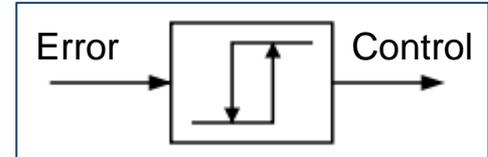
[2] A. Pikovskij et al., "Synchronization: a universal concept in nonlinear sciences", Cambridge Univ. Press, 2003

[3] A. Arenas et al., "Synchronization in complex networks," Phys. Rep., 2008

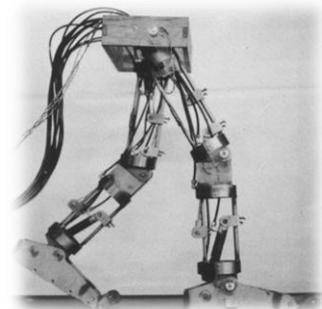
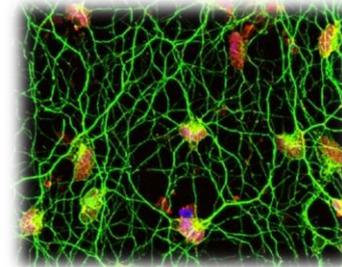
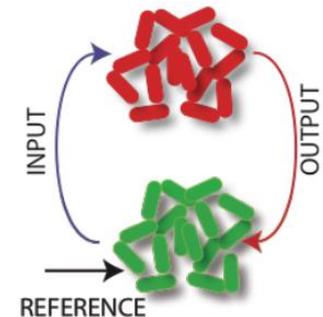
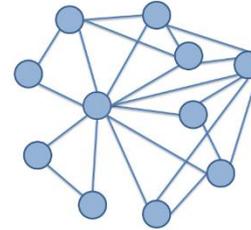
[4] L. Scardovi, R. Sepulchre, "Synchronization in networks of identical linear systems," Automatica, 2009

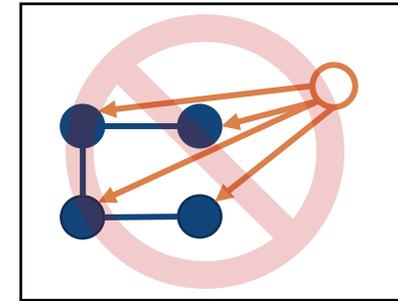
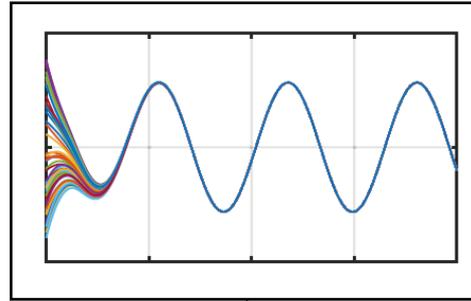
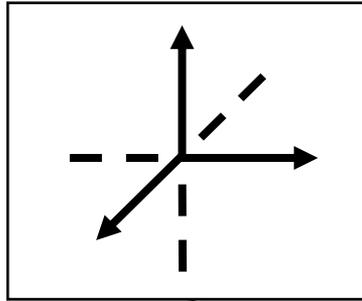
[5] P. DeLellis, M. di Bernardo, G. Russo, "On QUAD, Lipschitz, and contracting vector fields for consensus and synchronization of networks," IEEE Transactions on Circuits and Systems I: Regular Papers, 2011

- Typical assumption: nodes in the network have *smooth* dynamics (ODE).
- **Not true** in many cases:
 - switching control systems,
 - mechanical gears,
 - neuron and cardiac cells,
 - power converters...



- In several real-world networks, nodes might be modeled as **piecewise-smooth systems** (discontinuous dynamics):
 - drivelines of vehicles,
 - power grids,
 - cell populations,
 - cooperative robot tasks,
 - biological neuron networks.





Paper	Global sync.	Asymptotic sync.	Control	Lack of centralised control
[1]	✓	✓	Yes	X
[2]	✓	X	No	✓
[3]	X	~ some cases	No	✓
[4]	✓	✓	Yes	✓



[1] X. Yang, Z. Wu, J. Cao, “Finite-time synchronization of complex networks with nonidentical discontinuous nodes,” *Nonlin. Dyn.*, 2013.

[2] P. De Lellis, M. di Bernardo, D. Liuzza, “Convergence and sync. in heterogeneous networks of smooth and piecewise smooth systems,” *Automatica*, 2015.

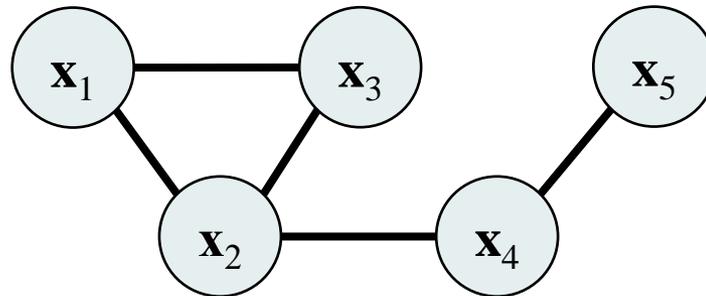
[3] S. Coombes, R. Thul, “Synchrony in networks of coupled non-smooth dynamical systems: Extending the master stability function”, *Eur. J. Appl. Math.*, 2016.

[4] M. Coraggio, P. De Lellis, M. di Bernardo, “Convergence and synchronization in Networks of PWS Systems via distributed discontinuous coupling”, *Automatica*, 2022.

- Network model:

$$\dot{\mathbf{x}}_i = \mathbf{f}(\mathbf{x}_i) - \sum_{j=1}^N L_{ij} \mathbf{g}(\mathbf{x}_i, \mathbf{x}_j), \quad i = 1, \dots, N.$$

internal node dynamics

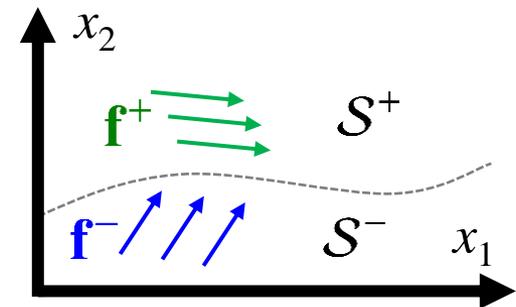


coupling

\mathbf{L} : Laplacian matrix of graph

- \mathbf{f} is in general **discontinuous**, e.g.,

$$\mathbf{f}(\mathbf{x}) = \begin{cases} \mathbf{f}^+(\mathbf{x}), & \mathbf{x} \in \mathcal{S}^+ \\ \mathbf{f}^-(\mathbf{x}), & \mathbf{x} \in \mathcal{S}^- \end{cases}$$



- We seek sufficient conditions for **synchronization** of the nodes:



$$\lim_{t \rightarrow \infty} \|\mathbf{x}_i(t) - \mathbf{x}_j(t)\| = 0, \quad \forall i, j.$$

- We want a synchronization that is:
 1. Global; (achievable from all initial conditions)
 2. Complete; (zero asymptotic synchronization error)
 3. Without a centralised control.

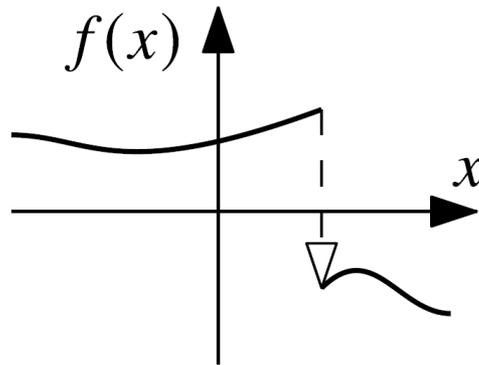


Main results

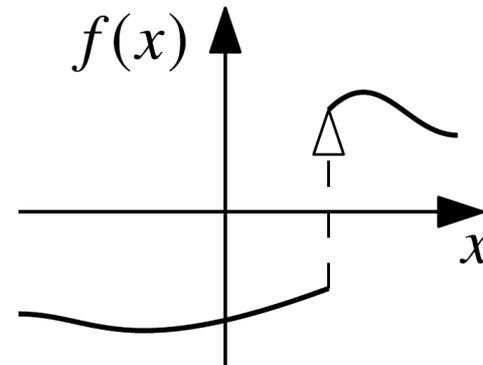
- First, we need some regularity condition on the dynamics \mathbf{f} .
- **QUADness** is a typical one, used in smooth networks:
(slightly more flexible than *one-sided Lipschitz continuity*)

$$(\mathbf{v}_1 - \mathbf{v}_2)^T \mathbf{P} [\mathbf{f}(\mathbf{v}_1) - \mathbf{f}(\mathbf{v}_2)] \leq (\mathbf{v}_1 - \mathbf{v}_2)^T \underline{\mathbf{Q}} (\mathbf{v}_1 - \mathbf{v}_2) \quad \forall \mathbf{v}_1, \mathbf{v}_2.$$

- Some discontinuous functions are QUAD.



QUAD function.



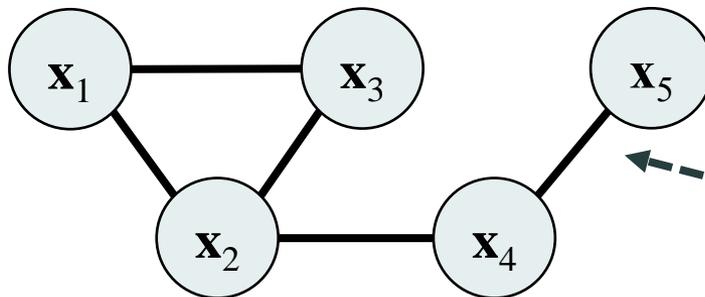
Non-QUAD function.

- Consider a **linear diffusive coupling**:

$$\dot{\mathbf{x}}_i = \mathbf{f}(\mathbf{x}_i) - \underbrace{c}_{\text{coupling strength}} \sum_{j=1}^N L_{ij} \Gamma(\mathbf{x}_j - \mathbf{x}_i), \quad i = 1, \dots, N,$$

coupling strength

- We seek a threshold value on c to attain synchronization.



e.g., coupling for \mathbf{x}_5

$$\underbrace{c \Gamma(\mathbf{x}_4 - \mathbf{x}_5)}$$

$$(\mathbf{v}_1 - \mathbf{v}_2)^T \mathbf{P} [\mathbf{f}(\mathbf{v}_1) - \mathbf{f}(\mathbf{v}_2)] \leq (\mathbf{v}_1 - \mathbf{v}_2)^T \mathbf{Q} (\mathbf{v}_1 - \mathbf{v}_2) \quad \forall \mathbf{v}_1, \mathbf{v}_2.$$

Theorem. Assume:

- \mathbf{f} is QUAD(\mathbf{P} , \mathbf{Q}), with $\mathbf{P} > 0$,
- $\Gamma > 0$.

The network synchronizes if $c > c^*$, where

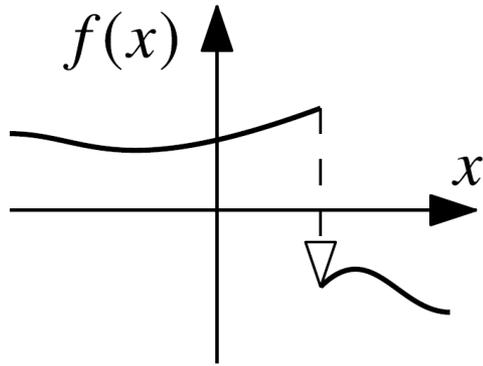
$$c^* \triangleq \frac{\mu_2(\mathbf{Q})}{\lambda_2(\mathbf{L}) \mu_2^-(\mathbf{P}\Gamma)}.$$

- Proof through a *common Lyapunov function*.

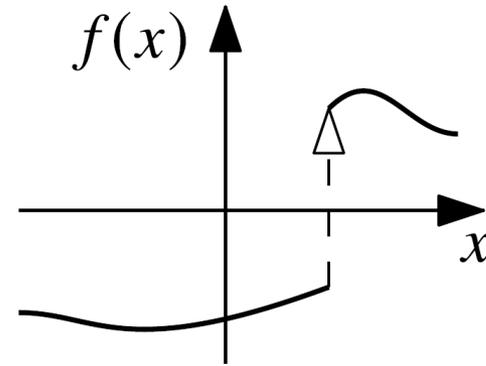
μ : matrix measure (logarithmic norm)
 $\mu_2(\mathbf{A}) = \lambda_{\max}(\text{sym}(\mathbf{A}))$,
 $\mu_2^-(\mathbf{A}) = -\mu_2(-\mathbf{A}) = \lambda_{\min}(\text{sym}(\mathbf{A}))$,



- Problem: many PWS functions are not QUAD.



QUAD, σ -QUAD.

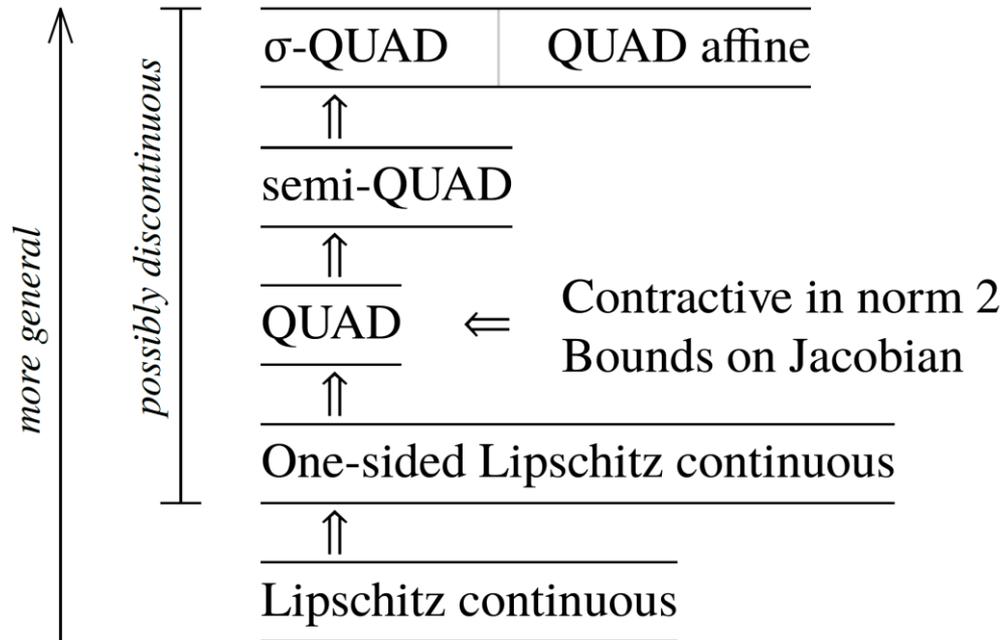


Not QUAD, σ -QUAD.

- We define **σ -QUADness**, a less restrictive assumption on \mathbf{f} :

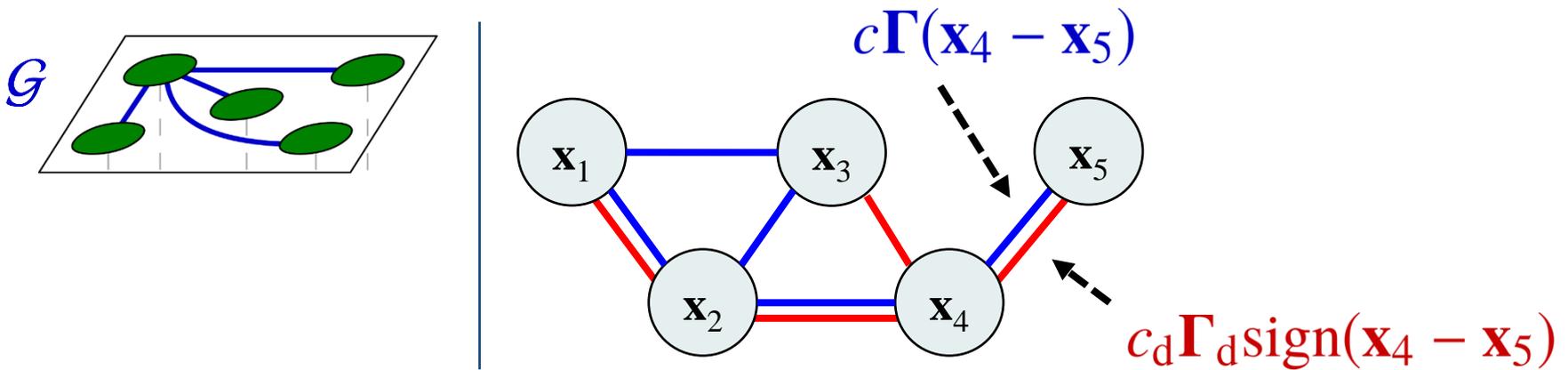
$$(\mathbf{v}_1 - \mathbf{v}_2)^T \mathbf{P} [\mathbf{f}(\mathbf{v}_1) - \mathbf{f}(\mathbf{v}_2)] \leq (\mathbf{v}_1 - \mathbf{v}_2)^T \mathbf{Q} (\mathbf{v}_1 - \mathbf{v}_2) \quad \forall \mathbf{v}_1, \mathbf{v}_2$$

- Now, \mathbf{f} can have any number of finite jumps.



<i>Lipschitz continuity:</i>	$\ \mathbf{f}(\mathbf{v}_1) - \mathbf{f}(\mathbf{v}_2)\ \leq Q \ \mathbf{v}_1 - \mathbf{v}_2\ $
<i>One-sided Lipschitz:</i>	$(\mathbf{v}_1 - \mathbf{v}_2)^\top [\mathbf{f}(\mathbf{v}_1) - \mathbf{f}(\mathbf{v}_2)] \leq Q \ \mathbf{v}_1 - \mathbf{v}_2\ ^2$
<i>QUADness:</i>	$(\mathbf{v}_1 - \mathbf{v}_2)^\top \mathbf{P} [\mathbf{f}(\mathbf{v}_1) - \mathbf{f}(\mathbf{v}_2)] \leq (\mathbf{v}_1 - \mathbf{v}_2)^\top \mathbf{Q} (\mathbf{v}_1 - \mathbf{v}_2)$

- Start with linear diffusive coupling layer.
- Add a **discontinuous coupling** layer (even different edges).

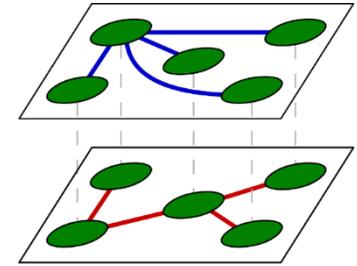


- We have a *multiplex* network:

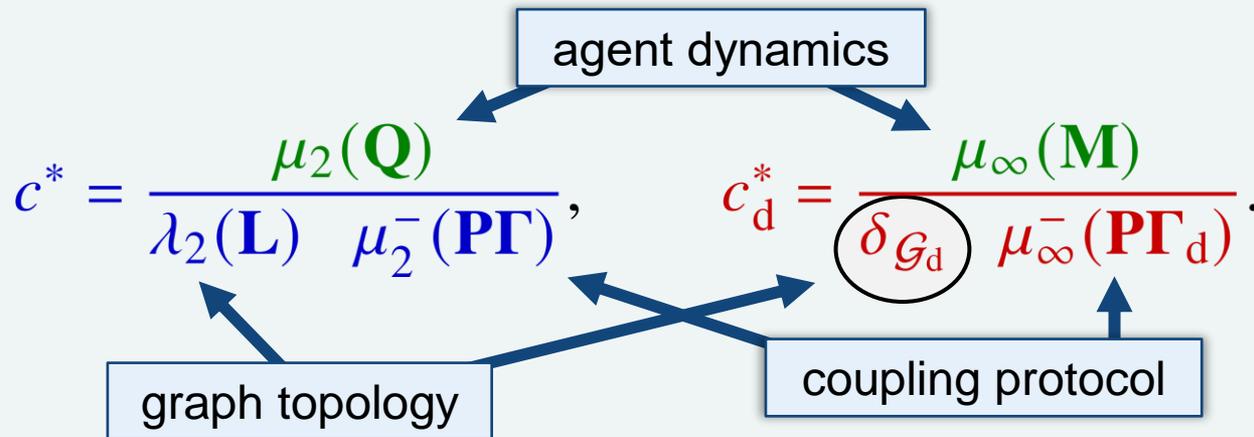
$$\dot{\mathbf{x}}_i = \mathbf{f}(\mathbf{x}_i) - \left(c \right) \sum_{j=1}^N L_{ij} \Gamma(\mathbf{x}_j - \mathbf{x}_i) - \left(c_d \right) \sum_{j=1}^N L_{ij}^d \Gamma_d \text{sign}(\mathbf{x}_j - \mathbf{x}_i).$$

Theorem. Assume

- \mathbf{f} is σ -QUAD(\mathbf{P} , \mathbf{Q} , \mathbf{M}), with $\mathbf{P} > 0$,
- $\mathbf{\Gamma}, \mathbf{\Gamma}_d > 0$.



The network synchronizes if $c > c^*$ and $c_d \geq c_d^*$, where

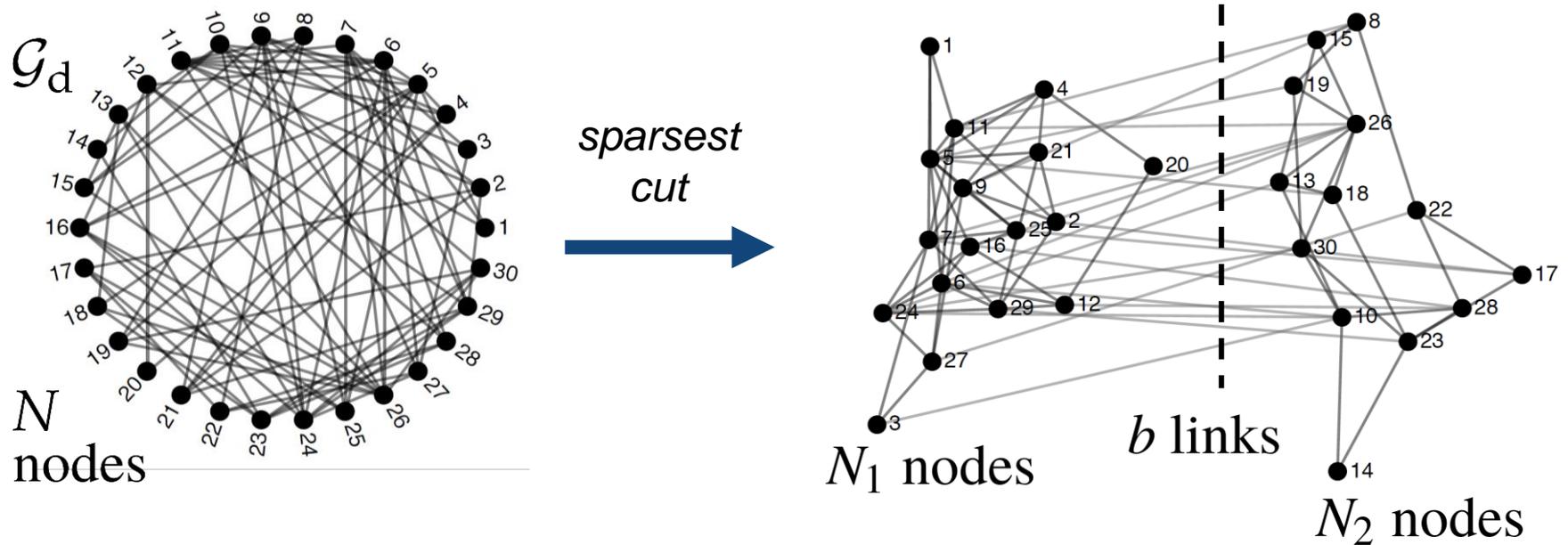


$$\mu_\infty(\mathbf{A}) = \max_i (A_{ii} + \sum_{j=1, j \neq i}^n |A_{ij}|),$$

$$\mu_\infty^-(\mathbf{A}) = -\mu_\infty(-\mathbf{A}) = \min_i (A_{ii} - \sum_{j=1, j \neq i}^n |A_{ij}|).$$



- $\delta_{\mathcal{G}_d}$: **minimum density** of \mathcal{G}_d ; computed from *sparsest cut*.

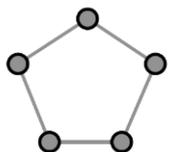
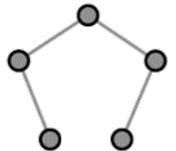
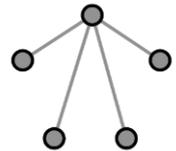
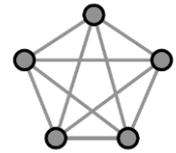


$$\delta_{\mathcal{G}_d} \triangleq \frac{N}{2} \min \frac{b}{N_1 N_2}$$

NP-hard,
but...

- We devised an algorithm and found simple formulae for selected topologies (complete, star, ring, path, k-nearest-neighbours).

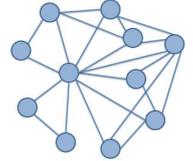
- Complete: $\delta_{\mathcal{G}} = \frac{N}{2}$
- Star: $\delta_{\mathcal{G}} = \frac{N}{2(N-1)}$
- Path: $\delta_{\mathcal{G}} = \begin{cases} 2/N, & N \text{ even} \\ 2N/(N^2-1), & N \text{ odd} \end{cases}$
- Ring: $\delta_{\mathcal{G}} = \begin{cases} 4/N, & N \text{ even} \\ 4N/(N^2-1), & N \text{ odd} \end{cases}$
- l -nearest neighbours: $\delta_{\mathcal{G}} = \begin{cases} \frac{4 \sum_{k=0}^{l-1} (l-k)}{N}, & N \text{ even} \\ \frac{4N \sum_{k=0}^{l-1} (l-k)}{N^2-1}, & N \text{ odd} \end{cases}$



Examples and numerical considerations

- Consider $N = 30$ chaotic relay systems $\dot{\mathbf{x}}_i = \mathbf{f}(\mathbf{x}_i)$, with

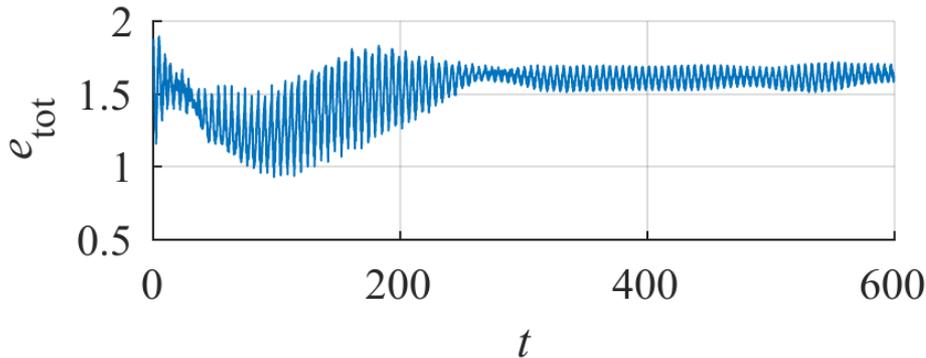
$$\mathbf{f}(\mathbf{x}_i) = \begin{bmatrix} 1.51 & 1 & 0 \\ -99.922 & 0 & 1 \\ -5 & 0 & 0 \end{bmatrix} \mathbf{x}_i - \begin{bmatrix} 1 \\ -2 \\ 1 \end{bmatrix} \text{sign}(x_{i,1}).$$



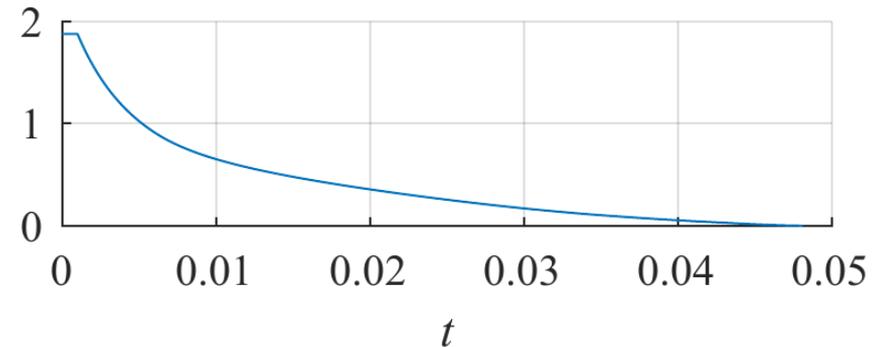
- These systems are σ -QUAD with

$$\mathbf{P} = \mathbf{I}, \quad \mathbf{Q} = \begin{bmatrix} 1.51 & 1 & 0 \\ -99.922 & 0 & 1 \\ -5 & 0 & 0 \end{bmatrix}, \quad \mathbf{M} = \begin{bmatrix} 0 & 0 & 0 \\ 4 & 0 & 0 \\ 0 & 0 & 0 \end{bmatrix}.$$

- Coupling protocol: $\mathbf{\Gamma} = \mathbf{\Gamma}_d = \mathbf{I}$;
Diffusive layer: $\lambda_2(\mathbf{L}) = 1$;
Discontinuous layer: $\delta_{\mathcal{G}_d} = 1.29$.
- $c^* = \mu_2(\mathbf{Q}) / \lambda_2(\mathbf{L}) = 50.31$, $c_d^* = \mu_\infty(\mathbf{M}) / \delta_{\mathcal{G}_d} = 3.10$.



No synchronization
($c = 0.1 < c^*$, $c_d = 0.001 < c_d^*$).



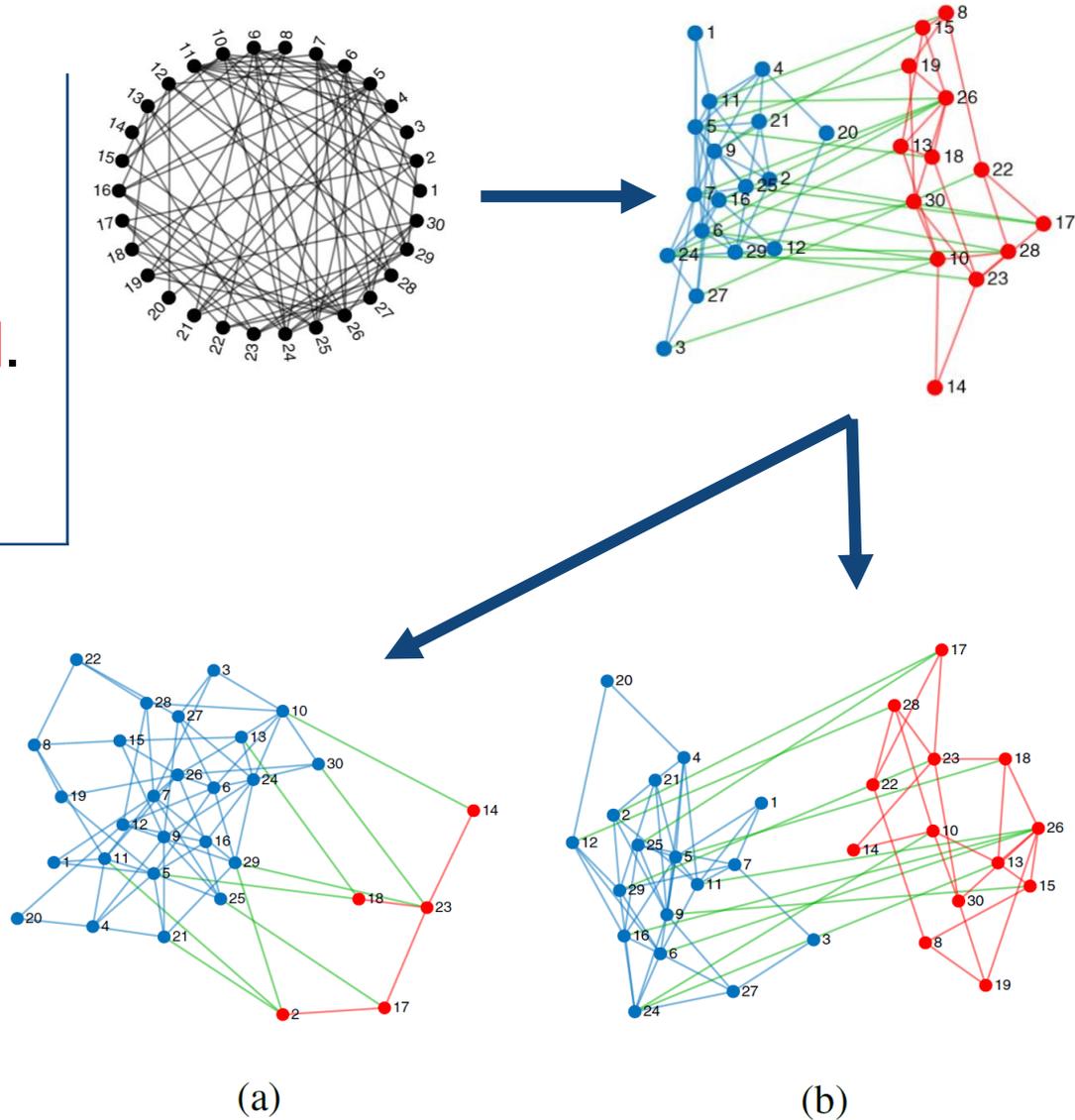
Synchronization
($c = 51 > c^*$, $c_d = 3.2 > c_d^*$).

- Resilience: how c_d^* changes when edges are removed?

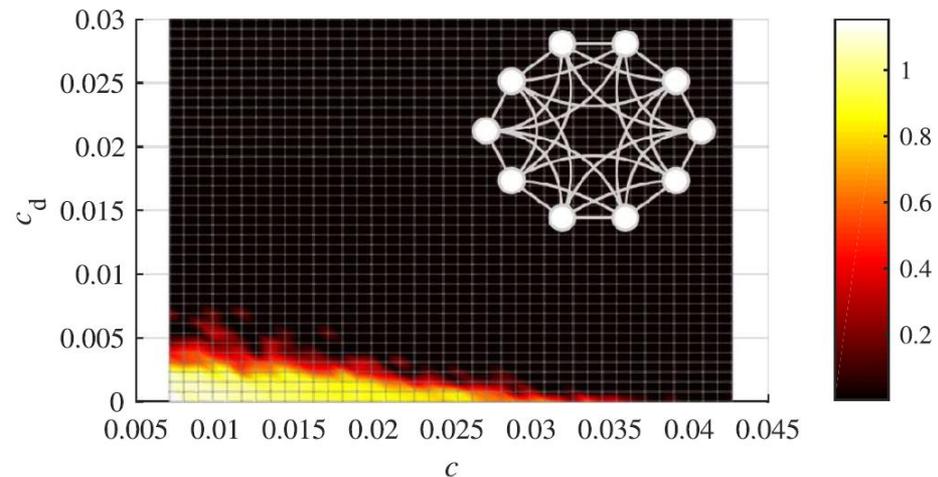
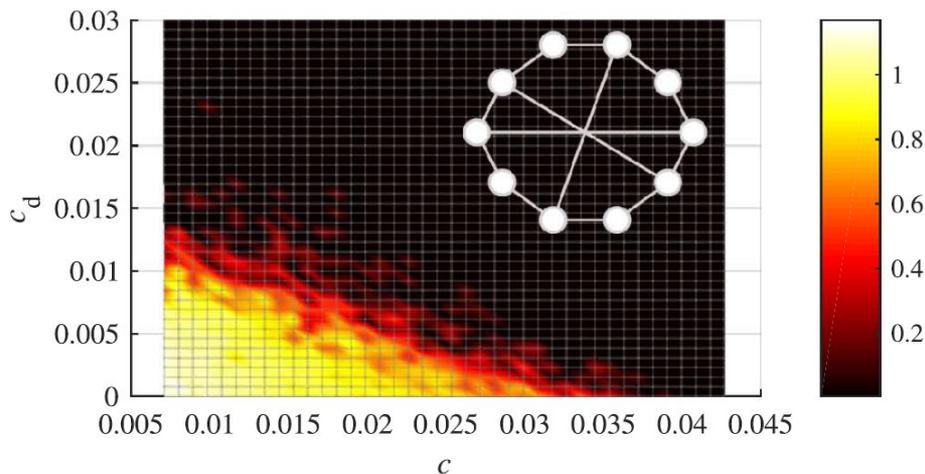
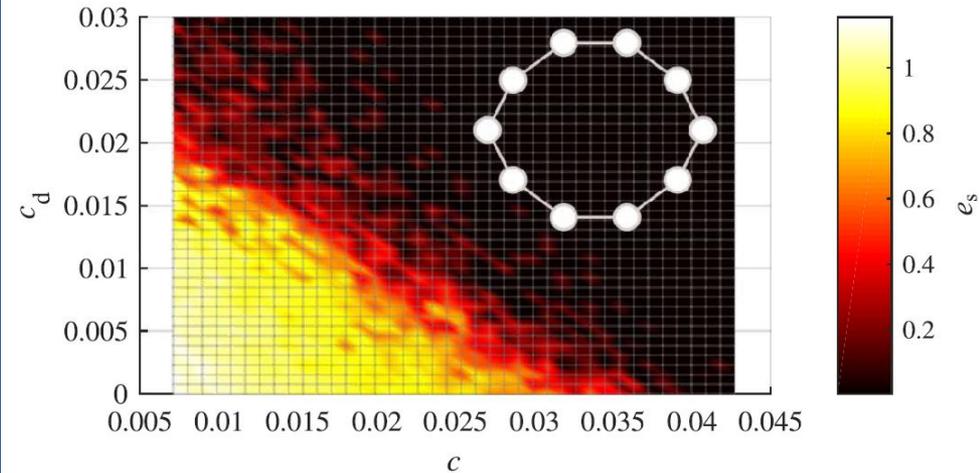
a) Remove 4 blue & 4 red.

b) Remove 8 green.

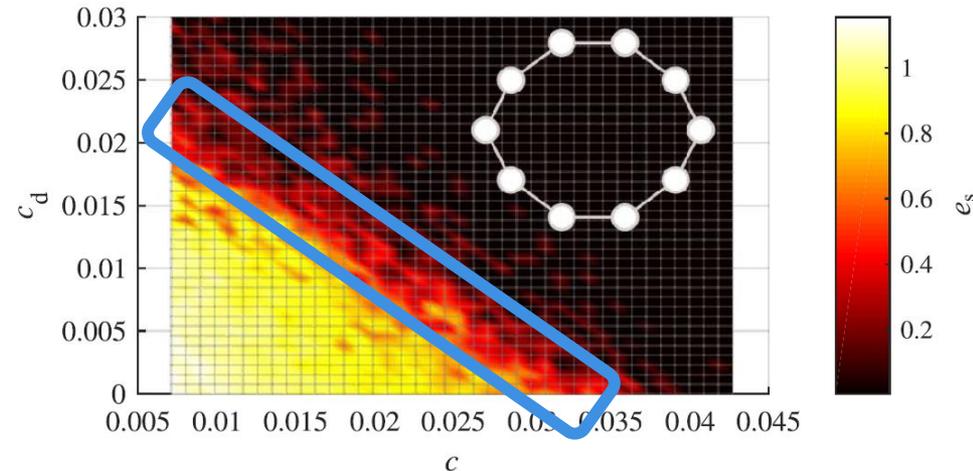
- $\delta_{\mathcal{G}_{d,a}} > \delta_{\mathcal{G}_{d,b}}$
(a better than b).
So *here* **inter-cluster edges** are more important to have a low threshold c_d^* .



- $N = 10$ Sprott circuits;
L: 3-nearest-neighbours;
L_d: variable.
- Different synchronizability with different topologies.



- What is the relation *between* the gains? Can we find smaller thresholds c^* , c_d^* that depend on each other?



- We found that discontinuous coupling can also be used to:
 - **Synchronize heterogeneous agents** [1].
 - Compensate disturbances.



2

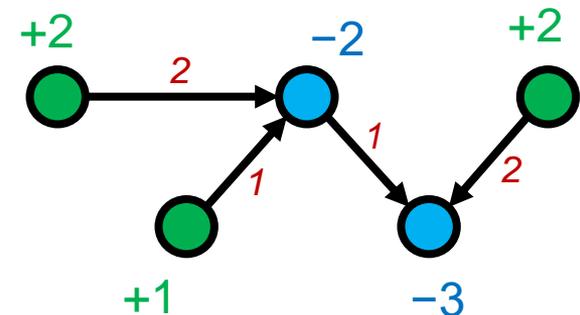
The minimax flow
problem in flow
networks

Introduction to the problem

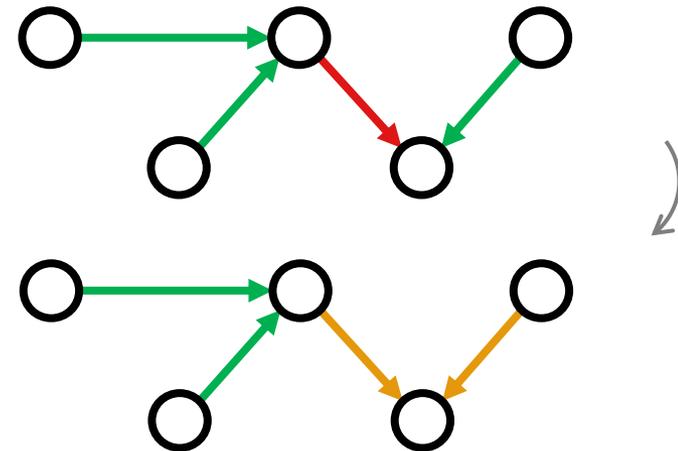
- Flow networks are ubiquitous in nature and engineering.



- Some **commodity** flows between nodes, which are **suppliers** or **consumers**;



- Each edge has a *maximum capacity* for the flow.
- If the capacity is met, a fault occurs.
- We wish to maximize robustness to such faults.
- To do so, we aim to **minimize the maximum flow.**



■: close to failure ■: fine ■: distressed

- *Minimax problems on graphs* have a long history and many variations exist (e.g. [1]).
- Distributed solutions [2] are important in many applications, such as new-generation power grids.
- We could not find in the literature our exact problem.
- Yet, in [3], a very similar one is considered, providing only an approximate solution.



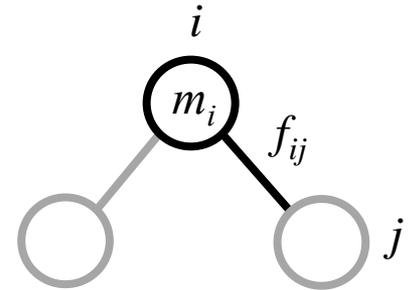
[1] P. L. Hammer, "Time-minimizing transportation problems: Time-minimizing transportation," *Naval Research Logistics Quarterly*, 1969.

[2] A. Nedić and J. Liu, "Distributed Optimization for Control," *Annu. Rev. Control Robot. Auton. Syst.*, 2018

[3] S. Z. Anaraki and M. Kalantari, "Acceleration of distributed minimax flow optimization in networks," 2011 45th Annual Conference on Information Sciences and Systems, 2011.

- We consider acyclic graphs.
- Flow network model (static):

$$\sum_{\text{edges } \{i, j\}} f_{ij} = m_i, \quad \forall \text{ nodes } i; \quad \left(\sum_{\text{all nodes } i} m_i = 0 \right).$$



- Cost function: $J \triangleq \max_{\text{all edges } \{i, j\}} \frac{|f_{ij}|}{\bar{f}_{ij}}$

$m_i \in \mathbb{R}$: commodity
 $f_{ij} \in \mathbb{R}$: flow
 $\bar{f}_{ij} \in \mathbb{R}_{>0}$: capacity

- Optimization problem: $\min_{\underline{m}_i \text{ for supplier nodes } i} J,$
 s.t. $m_{i,\min} \leq m_i \leq m_{i,\max}, \quad \forall \text{ supplier nodes } i.$

Main results

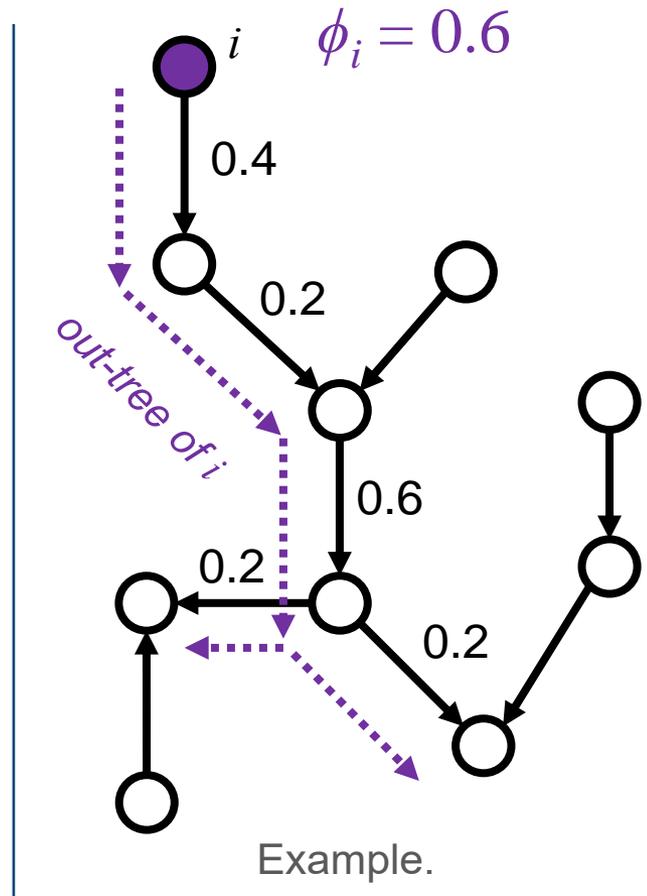
Definition. For each node i , **maximum downstream flow** ϕ_i is the maximum flow in the *out-tree* of node i .

$$\phi_i := \max_{(j,k) \in \mathcal{D}_i} \frac{f_{jk}}{\bar{f}_{jk}} \geq 0$$

- ϕ_i s give global information but can be computed with local information: (exploiting acyclicity of the graph)

$$\phi_i = \max_{j \in \text{out-neig}(i)} \left\{ \phi_j, \beta_{ij} \frac{f_{ij}}{\bar{f}_{ij}} \right\}$$

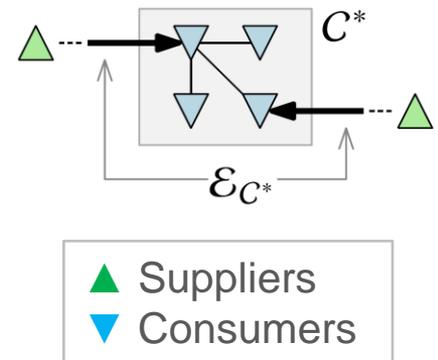
$$\dot{\hat{\phi}}_i(t) = -k_\phi \left(\hat{\phi}_i(t) - \max_{j \in \text{out-neig}(i)} \left\{ \beta_{ij} \frac{f_{ij}}{\bar{f}_{ij}}, \hat{\phi}_j(t) \right\} \right), \hat{\phi}_i(0) = 0$$



\mathcal{D}_i : downstream of i (excluding branches with consumers only)
 β_{ij} : Boolean to exclude uncontrollable flows

Theorem. If the maximum downstream flows ϕ_i of all suppliers are equal, then the max flow (J) is minimized.

- We turned the optimization problem into a synchronization problem.
- Proof based on graph-theoretic arguments.



- To achieve synchronization, we use a **distributed control law** akin to:

$$\dot{m}_i = -k_\phi (\phi_i - \phi_{\text{avg}}).$$

ϕ_{avg} : average of ϕ_i for suppliers

$$\gamma_i(t) \triangleq \begin{cases} 1, & \text{if } P_{\min,i} < P_i(t) < P_{\max,i} \\ 0, & \text{otherwise} \end{cases} \quad i \in \mathcal{V}_s$$

$$\hat{\phi}_{\text{avg},i}^{\text{n-sat}}(t) \triangleq \text{mean} \left\{ \{\hat{\phi}_i(t)\} \cup \{\hat{\phi}_j(t)\}_{j \in \mathcal{V}_s | j \neq i, \gamma_j = 1} \right\}, \quad i \in \mathcal{V}_s$$

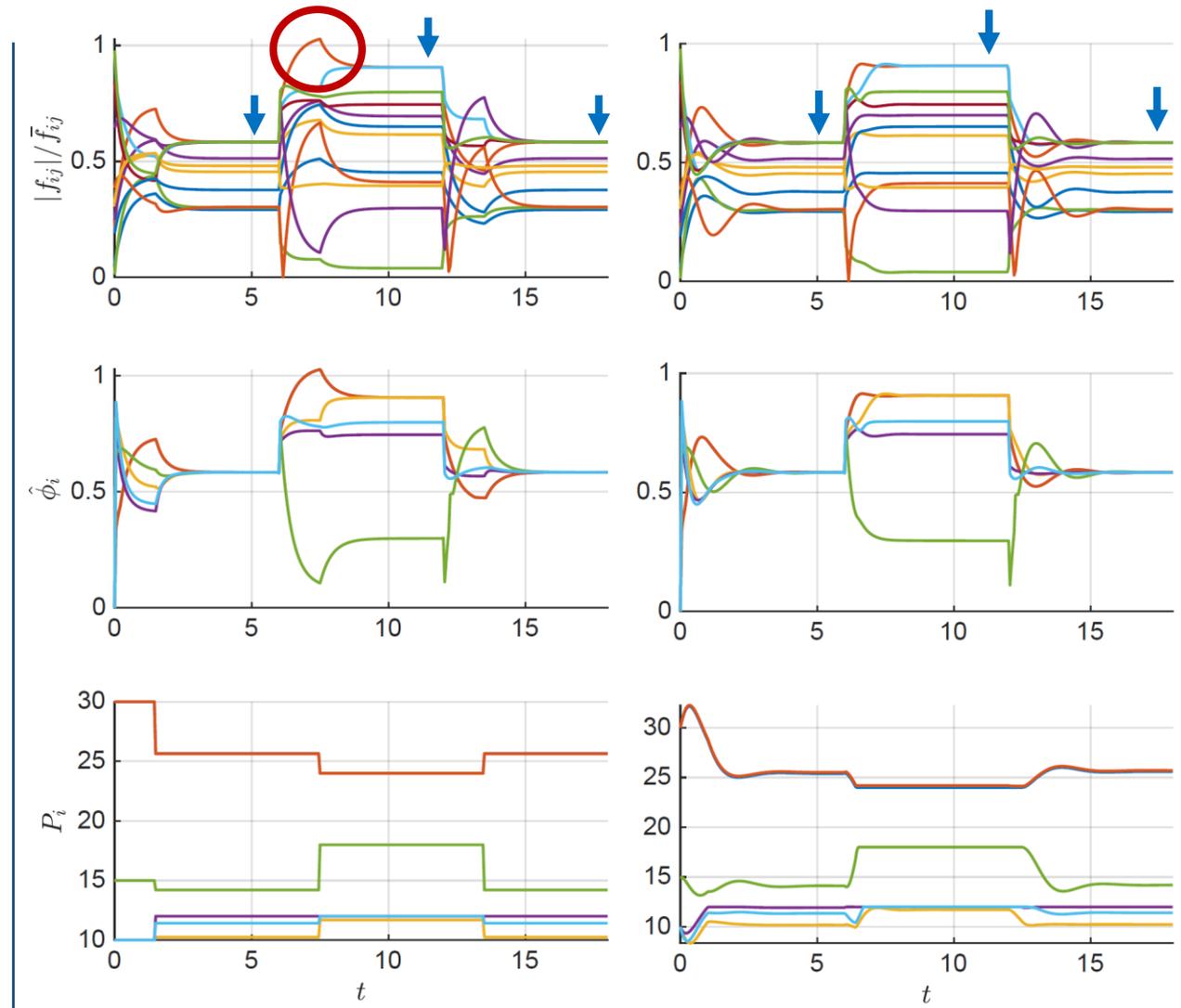
$$\hat{\phi}_{\text{max},i}^{\text{sat}}(t) \triangleq \max \left\{ \hat{\phi}_j(t) \right\}_{j \in \mathcal{V}_s | j \neq i, \gamma_j = 0}, \quad i \in \mathcal{V}_s$$

$\dot{P}_i = \begin{cases}$	Recall: $\dot{m}_i = -k_\phi(\phi_i - \phi_{\text{avg}}).$	if $\gamma_k = 1 \quad \forall k \in \mathcal{V}_s$
		if $(\exists k \in \mathcal{V}_s : \gamma_k = 0) \wedge$ $(\gamma_i = 1 \vee \zeta_i = 1)$
		otherwise
		$\left. \begin{matrix} P_i, \\ 0, \end{matrix} \right\}$

$$\tilde{P}_i \triangleq -k_P \left(\hat{\phi}_i - \hat{\phi}_{\text{avg},i}^{\text{n-sat}} \right) - k_P^\gamma \left(\hat{\phi}_{\text{avg},i}^{\text{n-sat}} - \hat{\phi}_{\text{max},i}^{\text{sat}} \right)$$

$$\zeta_i \triangleq \begin{cases} 1, & \text{if } (P_i \leq P_i^{\min} \wedge \tilde{P}_i > 0) \vee \\ & (P_i \geq P_i^{\max} \wedge \tilde{P}_i < 0) \\ 0, & \text{otherwise} \end{cases}$$

- Our strategy achieves **same steady state cost J** as a centralised solution to the optimization.
- ... and **better transient.**



Centralised solution.

Our distributed strategy.

Conclusion

RECAP:

- **Discontinuous coupling** can synchronize piecewise-smooth (and heterogeneous) systems.
- **σ -QUADness** is an extension of one-sided Lipschitz for discontinuous functions
- The **minimum density** is an additional metric to capture the synchronizability of a graph.
- In flow networks, we defined the **maximum downstream flows**, which measure the stress caused by a supplier onto the network.
- The minimax flow problem can be solved through synchronization of the maximum downstream flows.

OPEN CHALLENGES:

- Find less conservative (possibly related) coupling thresholds c^* , c_d^* .
- Solve the minimax flow problem in cyclic networks.

Thank you for your attention.

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