

# Finite-time Average Consensus in a Byzantine Environment Using Stochastic Set-Valued Observers

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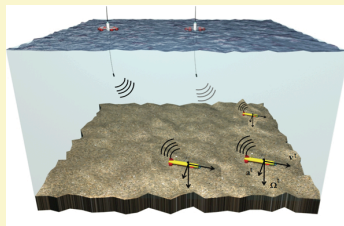
## Objectives:

- Compute the average of the initial states in finite-time
- Guarantee fault detection and bounds on the maximum possible deviation from an attack
- Incorporate the transmissions stochastic information in the fault detection mechanism.

## 1. Motivation

Nodes need to distributedly agree on a common value:

- Smart Grids when deciding the needed power
- Robot swarms to find rendezvous points
- Social Networks making a pool about a subject.



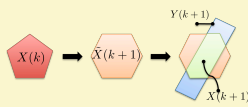
In all these examples a single node can drift the entire network to any desired value!

## 3. Proposed Solution

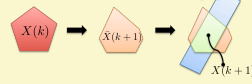
Each node runs a Stochastic Set-Valued Observer (SSVO). The estimates are intersected as to produce less conservative polytopes.

### 1) Compute the next set-valued estimates

Example of a SVO update for horizon 1.



Example of a SSVO update where low probability events are discarded.



### 2) Overbound using a hyper-parallelepiped to transmit estimates to neighbors

### 3) Intersect estimates by performing

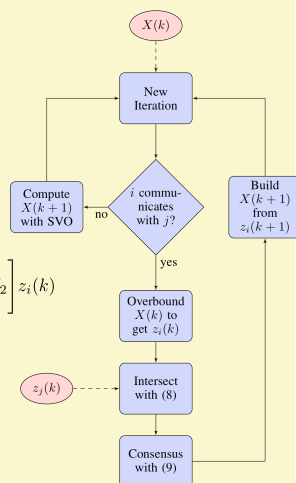
$$z_i(k) = z_j(k) = \max(z_i(k), z_j(k))$$

### 4) Perform a consensus update on the estimates interval

$$z_i(k+1) = \left[ \left( \frac{1}{2}(e_i - e_j)(e_j - e_i)^T + I_{n_x} \right) \otimes I_2 \right] z_i(k)$$

### Remark:

Fault detection consists in checking if the result of the intersection in step 3) is the empty set.



Flowchart of the proposed algorithm

## 2. Problem Statement

The objective is to compute the average of some quantity of interest. If faulty, any node  $i$  must detect the fault using only local information communicated from their neighbors.

### Network Model

$$G = (V, E)$$

$$E \subseteq V \times V$$

### System Model

$$S^i : \begin{cases} x(k+1) = \left( A_0 + \sum_{\ell=1}^{n_\Delta} \Delta_\ell(k) A_\ell \right) x(k) + B(k)u(k) \\ y^i(k) = C^i(k)x(k) \end{cases}$$

$n_\Delta$  number of uncertainties

Each  $S^i$  is a Linear Parameter-Varying (LPV) system

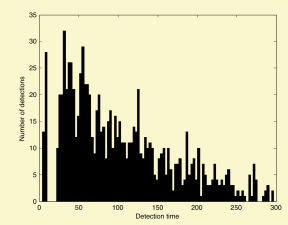
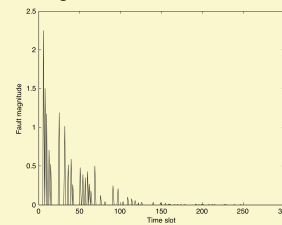
$\Delta_\ell(k)$  are scalar uncertainties

### Byzantine Consensus Problem:

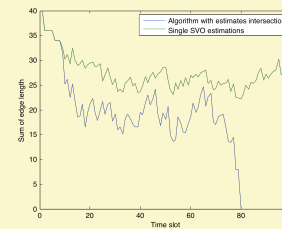
Either detect non-zero signals  $u(k)$  using  $y(k)$  without the knowledge of  $B(k)$  or compute the final consensus value.

## 4. Results

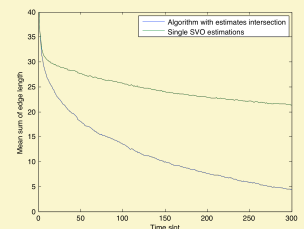
- The magnitude of an attacker fault signal is bounded.
- Faults are more likely to be detected as time increases.



- Finite-time consensus is achieved.



- Less conservative set-valued estimates.



### Main result:

The algorithm can either detect an intruder or compute the average consensus in finite-time.

[1] Silvestre, D.; Rosa, P.; Cunha, R.; Hespanha, J.P.; Silvestre, C., "Gossip average consensus in a Byzantine environment using stochastic Set-Valued Observers," *IEEE 52nd Annual Conference on Decision and Control (CDC)*, pp.4373,4378, 10-13 Dec. 2013

[2] Silvestre, D.; Rosa, P.; Hespanha, J.P.; Silvestre, C., "Finite-time Average Consensus in a Byzantine Environment Using Set-Valued Observers," *American Control Conference (ACC)*, pp.3023,3028, 4-6 Jun. 2014