

Implementation of distributed consensus with guaranteed real-time communication on an outdoor testbed

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Implementation of
distributed
consensus with
guaranteed
real-time
communication on
an outdoor testbed

Joshi, et. al.

Motivation

Hardware
Architecture

Communication
Protocol

Time synchronization

Slot allotment

Data transfer

Re-synchronization

Addressing contingencies

Performance

Consensus law

Quadrotors as double
integrators

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Consensus experiments

Conclusions

Motivation

- ▶ Several applications that require cooperation among flying robots

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- ▶ Substantial theoretical literature available on consensus of multi-agent systems with double integrator dynamics

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- ▶ Several applications that require cooperation among flying robots
- ▶ Substantial theoretical literature available on consensus of multi-agent systems with double integrator dynamics
- ▶ Practical implementation: outdoors, decentralized

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- ▶ Substantial theoretical literature available on consensus of multi-agent systems with double integrator dynamics
- ▶ Practical implementation: outdoors, decentralized

Quadrotors¹ can be approximated as double integrators, driven to consensus only using exchange of position data

Communication: Synchronized, no data collisions, guaranteed real-time

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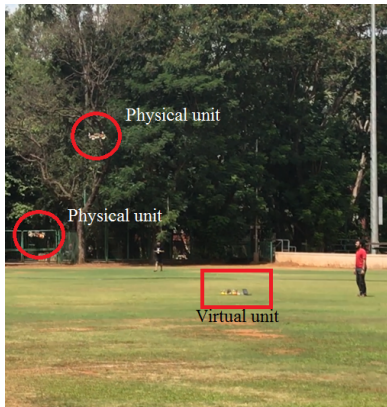
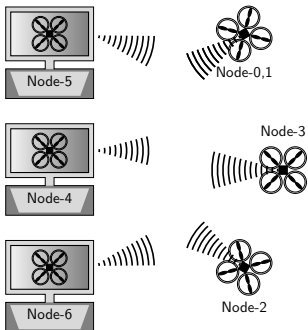
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¹Joshi et. al. Implementation of distributed consensus on an outdoor testbed, ECCV16

Testbed



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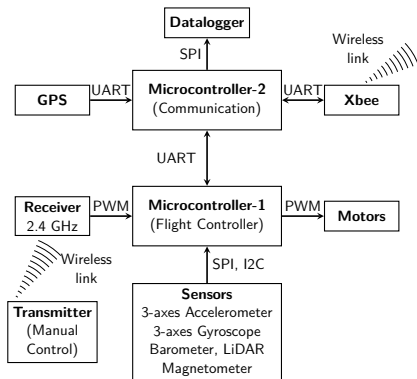


Figure: Physical unit

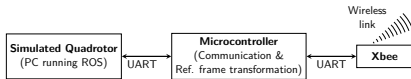


Figure: Virtual unit

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- ▶ Synchronized data transfer
- ▶ Real-time, no data collisions
- ▶ Fully airborne. No need of ground station
- ▶ Robust: can handle link breakage with synchronizing node

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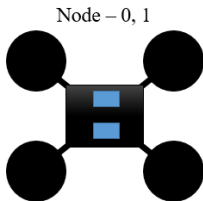
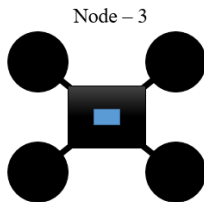
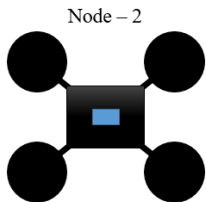
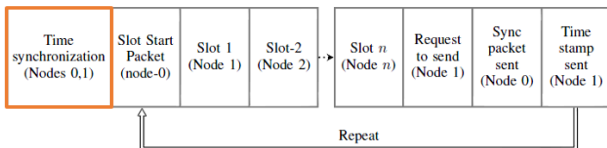
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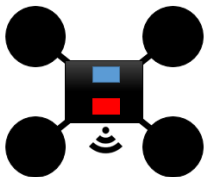
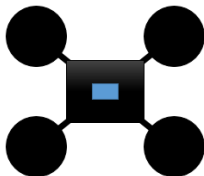
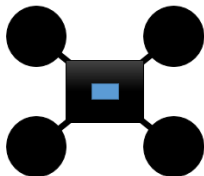
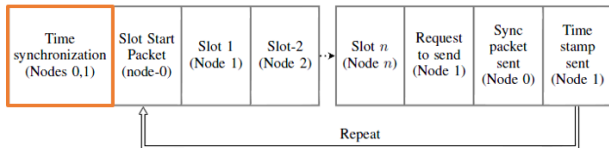
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Synchronization packet

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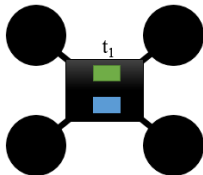
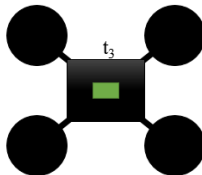
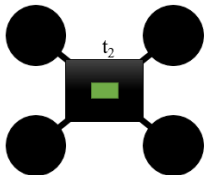
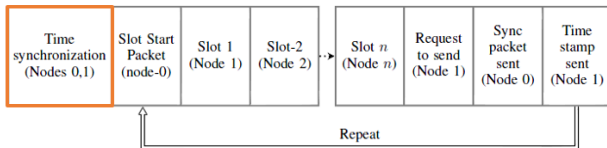
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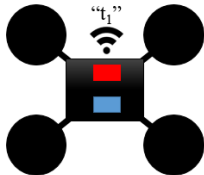
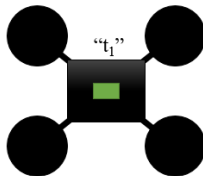
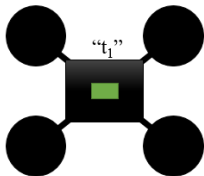
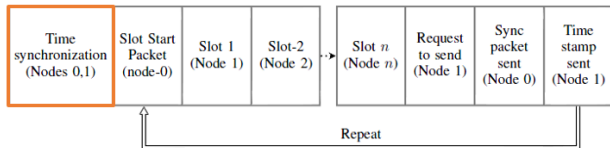
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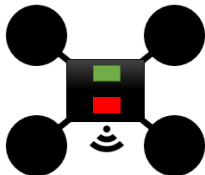
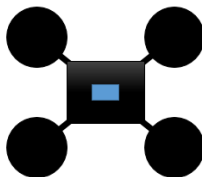
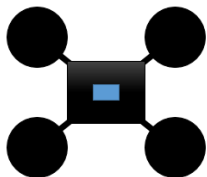
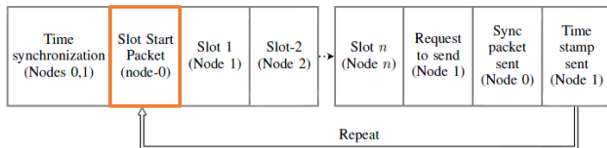
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Slot allotment complete

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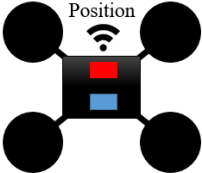
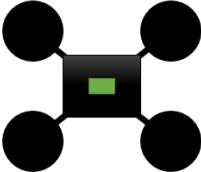
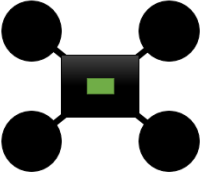
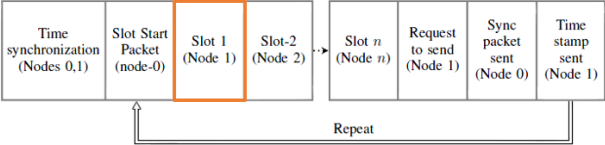
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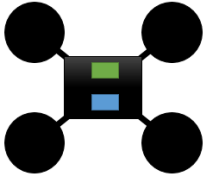
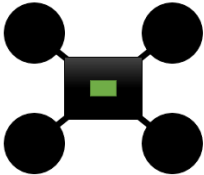
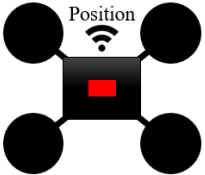
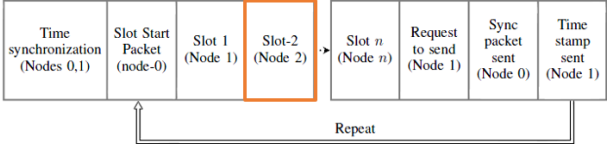
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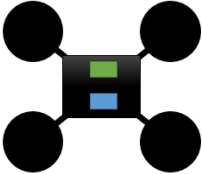
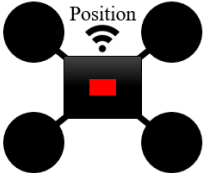
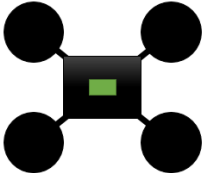
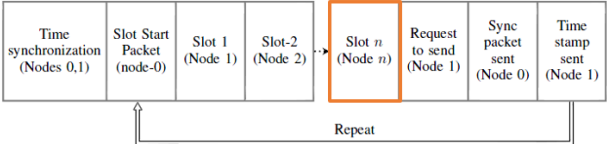
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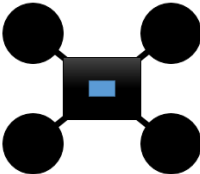
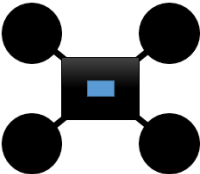
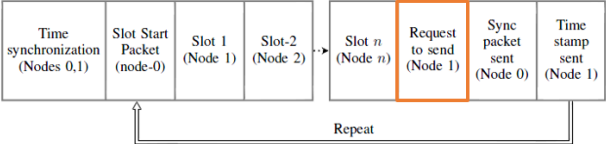
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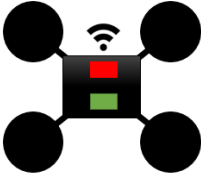
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Request re-synchronization



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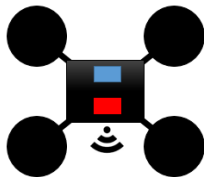
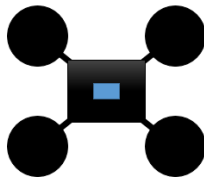
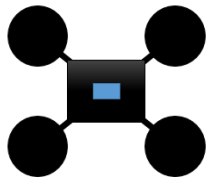
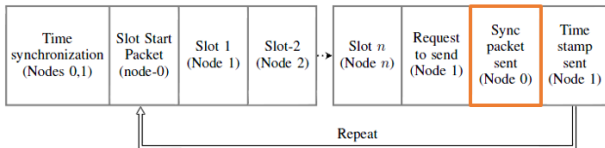
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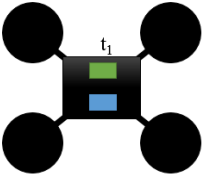
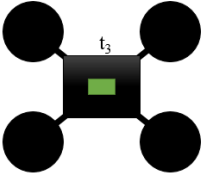
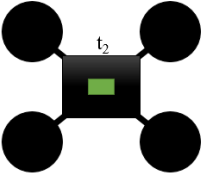
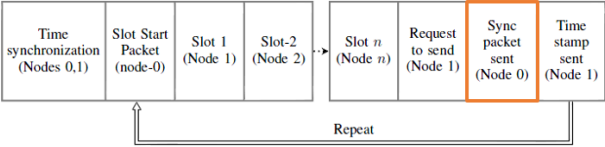
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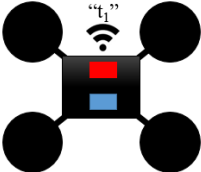
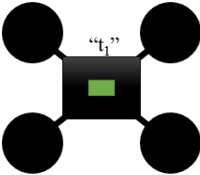
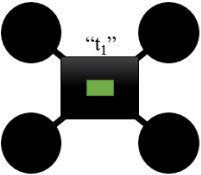
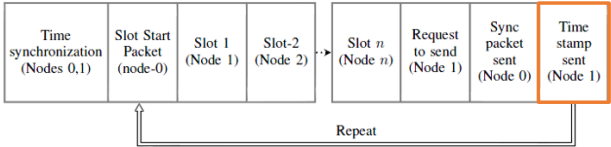
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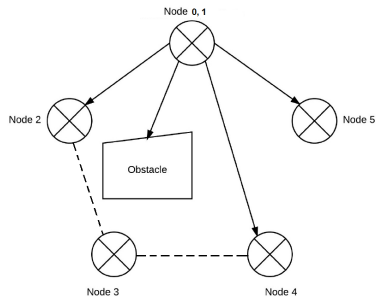
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- ▶ Link break with Node-0,1



- ▶ Link break with all nodes

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Indoor environment

- ▶ Area: 10 m × 10 m
- ▶ Duration: 300 s
- ▶ Average efficiency: 98.11%

Table: Efficiency (%) of data reception of six nodes: indoor

Node	1	2	3	4	5	6
1	-	95.64	99.75	99.88	99.50	96.02
2	97.66	-	91.82	100.00	99.50	96.02
3	99.41	96.85	-	98.82	99.38	95.90
4	99.53	98.67	99.87	-	100.00	96.52
5	98.36	98.67	98.49	99.88	-	92.55
6	99.41	96.25	99.62	99.88	99.38	-

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Outdoor environment

- ▶ Area: 55 m × 46 m
- ▶ Duration: 300 s
- ▶ Average efficiency: 90.25%

Table: Efficiency (%) of data reception of six nodes: outdoor

Node	1	2	3	4	5	6
1	-	92.49	91.20	94.24	89.22	90.77
2	91.18	-	93.88	89.22	88.34	91.39
3	84.24	91.49	-	92.84	87.09	92.02
4	86.09	89.87	91.07	-	89.61	92.76
5	89.30	91.99	92.69	90.86	-	91.76
6	86.66	91.36	87.39	91.47	85.21	-

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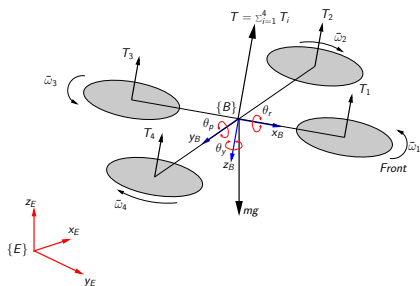
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► Control inputs:

- Roll, θ_r
- Pitch, θ_p
- Yaw, θ_y
- Thrust, T

$$f_x = T \sin \theta_p \approx T \theta_p$$

$$f_y = T \sin \theta_r \cos \theta_p \approx T \theta_r$$

for small θ_p and θ_r

If we can vary θ_p and θ_r independently and instantaneously, then motion in the $x_E y_E$ - plane can be modelled as a double integrator.

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Consider a team of n quadrotors. For each quadrotor i at time t :

- ▶ Position: $\mathbf{p}_i^E(t) = \begin{bmatrix} p_x^E(t) & p_y^E(t) \end{bmatrix}^T \in \mathbb{R}^2$
- ▶ Velocity: $\mathbf{v}_i^E(t) = \begin{bmatrix} v_x^E(t) & v_y^E(t) \end{bmatrix}^T \in \mathbb{R}^2$
- ▶ Consensus: $\|\mathbf{p}_i^E(t) - \mathbf{p}_j^E(t)\| \rightarrow 0$ and $\mathbf{v}_i^E \rightarrow 0$ as $t \rightarrow \infty$, for all $\mathbf{p}_i^E(0)$ and $\mathbf{v}_i^E(0)$ and all $i, j = 1, \dots, n$.

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Consensus Law

Consensus experiments

Conclusions

Consensus law

- ▶ Information exchange modelled as undirected graph $\mathcal{G}_n := (\mathcal{V}, \mathcal{E})$ where $\mathcal{V} = \{1, \dots, n\}$ is the set of nodes and $\mathcal{E} \subseteq (\mathcal{V} \times \mathcal{V})$ is the set of edges
- ▶ Node \equiv quadrotor, edge \equiv available communication channel
- ▶ Set of neighbours, $\mathcal{N}_i := \{j \in \mathcal{V} : (i, j) \in \mathcal{E}\}$.
- ▶ Adjacency matrix, $\mathcal{A}_n(\mathcal{G}_n) := [a_{ij}] \in \mathbb{R}^{n \times n}$
 - ▶ $a_{ij} = 1$, if communication link exists between agents i and j
 - ▶ $a_{ij} = 0$, otherwise

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Theorem

Given a system

$$\dot{\mathbf{p}}^E = \mathbf{v}^E, \quad \dot{\mathbf{v}}^E = \mathbf{f}^E \quad (1)$$

The control law ²,

$$\mathbf{f}_i^E = \sum_{j \in \mathcal{N}_i} a_{ij} (\mathbf{p}_j^E - \mathbf{p}_i^E) - \beta \mathbf{v}_i^E, \quad i = 1, \dots, n$$

achieves consensus asymptotically iff \mathcal{G}_n is connected

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²Proof similar to W. Ren, R. Beard, Distributed consensus in multi-vehicle cooperative control, Springer, 2008

Consensus experiments



A GPS plot of physical and virtual agents reaching consensus

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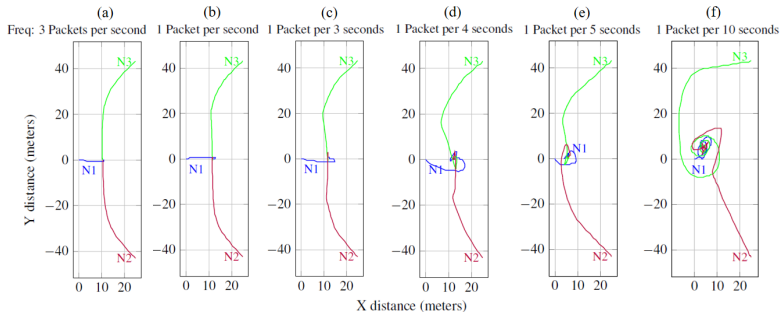
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Effect of different data exchange rates on consensus performance

Conclusions

- ▶ Consensus achieved between agents using only exchange of position information.
- ▶ Real-time information exchange achieved using synchronized communication protocol with no data collisions.
- ▶ All computations are decentralized. No need of ground station.
- ▶ Effect of communication rate on consensus performance studied.

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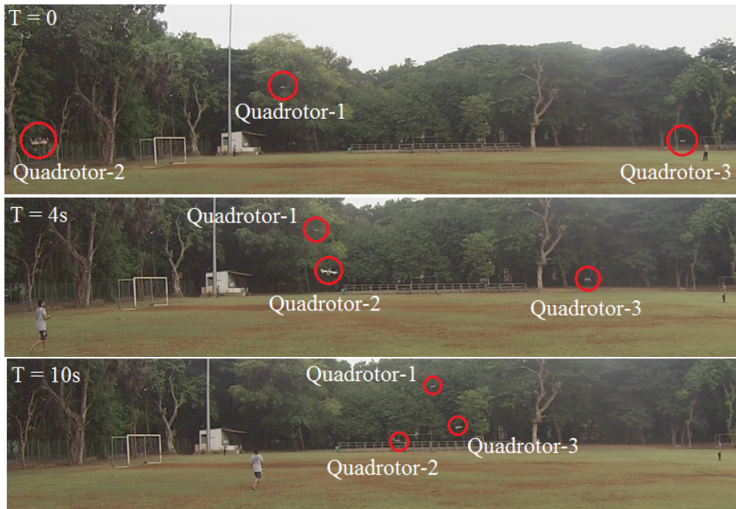
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Thank you :)

Questions?

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