

Active Monitoring with RTLola

A Specification-Guided Scheduling Approach

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Motivation

GPS Sensor

Altitude Sensor

Camera

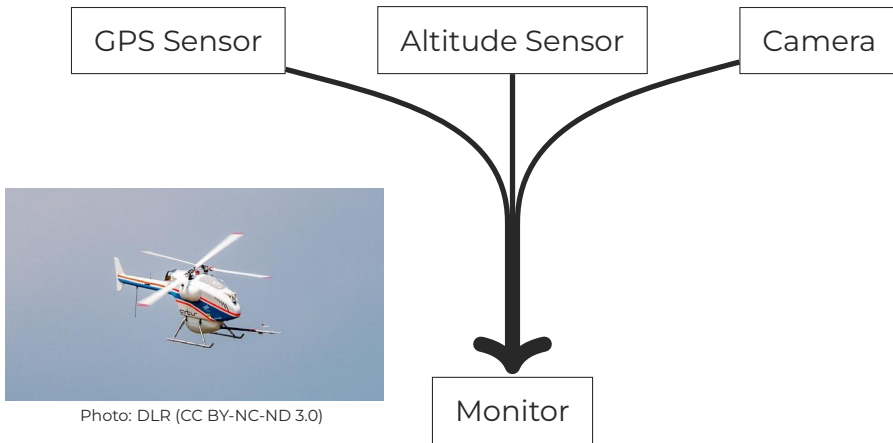


Photo: DLR (CC BY-NC-ND 3.0)

Monitor



Motivation





Monitoring Drone Sensors: Low Frequency

Video



Motivation

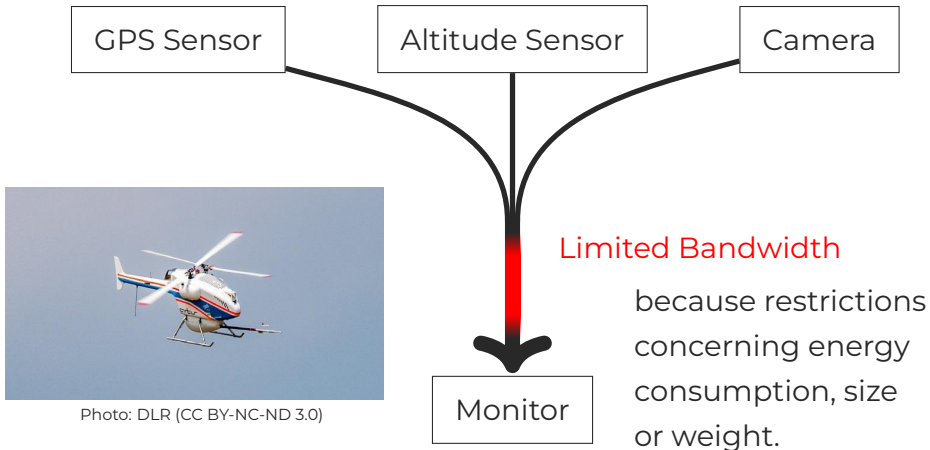
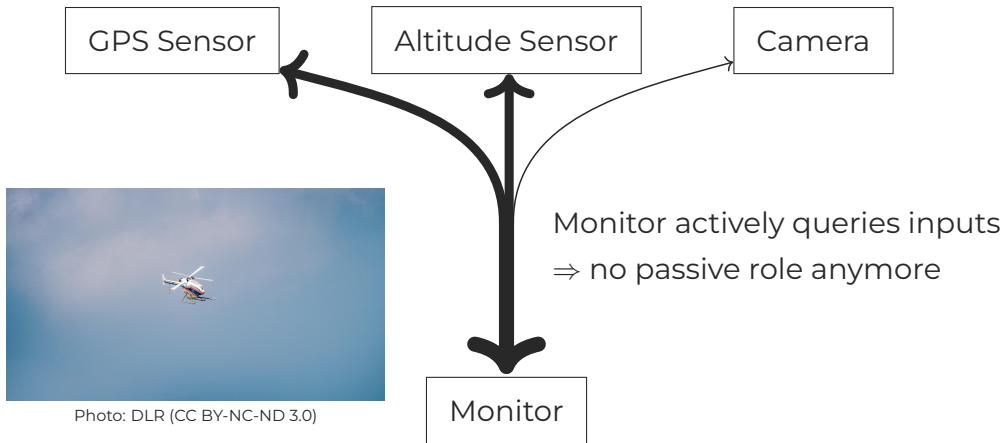


Photo: DLR (CC BY-NC-ND 3.0)

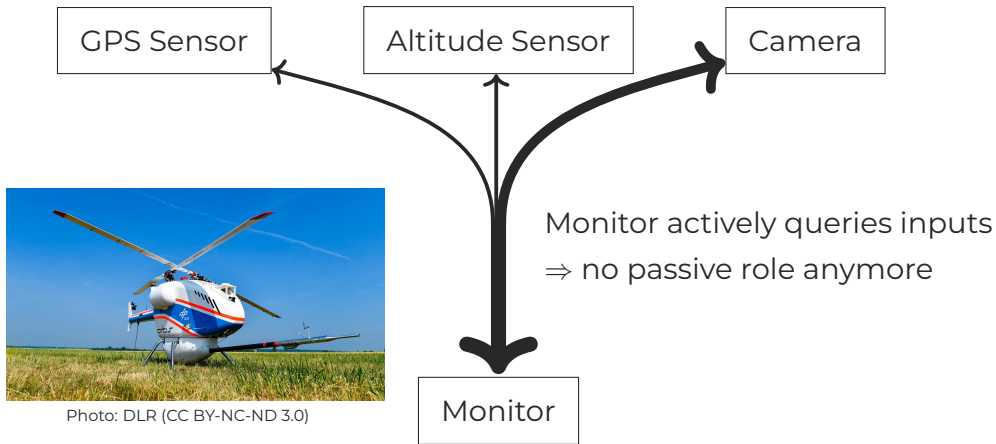


Motivation





Motivation





Monitoring Drone Sensors: Scheduled

Video



Evaluation Model $\mathbb{W}$ is valid, if:

- ⚙ Values are calculated according to specification
- 🕒 Timestamps are monotonically increasing



Scheduled Monitor Semantics

Evaluation Model $\mathbb{W}$ is valid, if:

- ⚙ Values are calculated according to specification
- 🕒 Timestamps are monotonically increasing, and
- ✉ Inputs arrive according to **scheduling constraint**.



Dynamic Scheduling Constraints

$$(\mathbb{W} \times \text{Time}) \rightarrow \text{Tasks} \rightarrow \mathbb{S}$$



Dynamic Scheduling Constraints

Evaluation Model



$(\mathbb{W} \times \text{Time}) \rightarrow \text{Tasks} \rightarrow \mathbb{S}$



Dynamic Scheduling Constraints

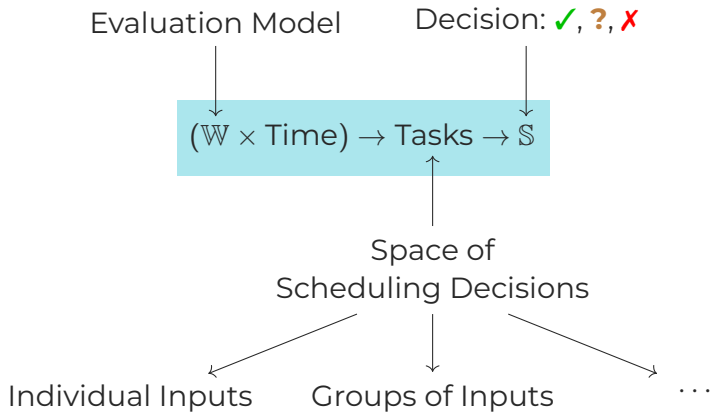
Evaluation Model

Decision: ✓, ?, ✗

$(\mathbb{W} \times \text{Time}) \rightarrow \text{Tasks} \rightarrow \mathbb{S}$



Dynamic Scheduling Constraints





Scheduling Constraints

Dynamic Constraint

$$(\mathbb{W} \times \text{Time}) \rightarrow \text{Tasks} \rightarrow \mathbb{S}$$

Requires access to the
whole evaluation model



Scheduling Constraints

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Static Constraint

$$\text{Tasks} \rightarrow \mathcal{P}(\text{Cond} \times \mathbb{V})$$

Can be evaluated
during runtime



Scheduling Constraints

Dynamic Constraint

$$(\mathbb{W} \times \text{Time}) \rightarrow \text{Tasks} \rightarrow \mathbb{S}$$

Requires access to the whole evaluation model

Static Constraint

$$\text{Tasks} \rightarrow \mathcal{P}(\text{Cond} \times \mathbb{V})$$

Can be evaluated during runtime



Translated
by the scheduling algorithm



Static Constraints

$$\text{Tasks} \rightarrow \mathcal{P}(\text{Cond} \times \mathbb{V})$$



Static Constraints

$$\text{Tasks} \rightarrow \mathcal{P}(\text{Cond} \times \mathbb{V})$$

Deadline

$\mathbb{V}$ are time durations:

e.g. 100ms, 1s, 5s

maximum duration
between evaluations



Static Constraints

Tasks $\rightarrow \mathcal{P}(\text{Cond} \times \mathbb{V})$

Deadline

Priority

$\mathbb{V}$ are time durations:
e.g. 100ms, 1s, 5s

$\mathbb{V}$ are priorities:

high, medium, low

maximum duration
between evaluations

highest priority tasks
are evaluated first



Static Constraints

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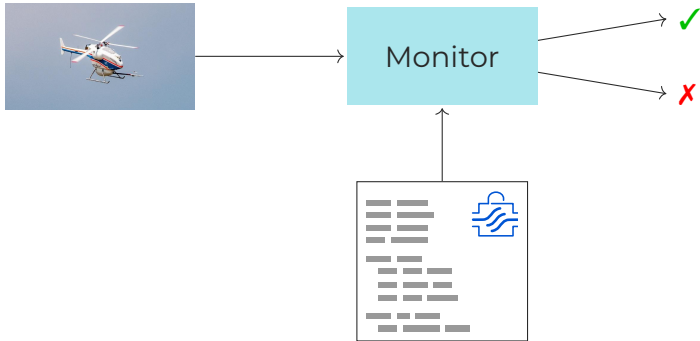
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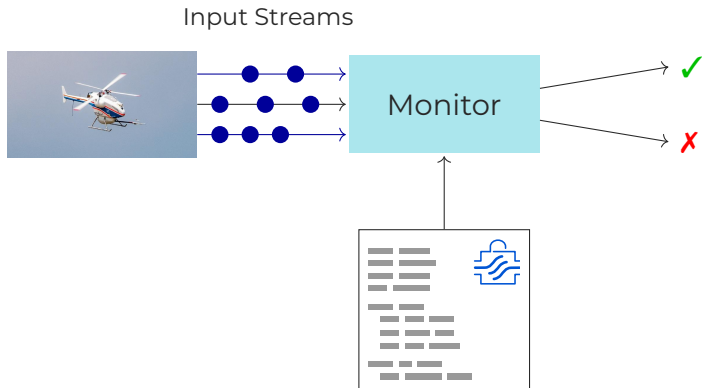
Priority + Deadline

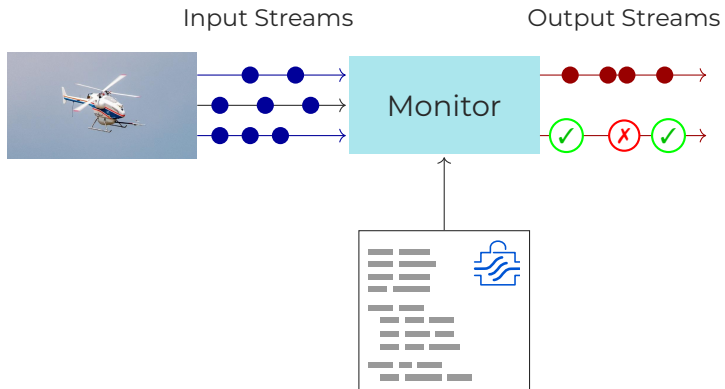
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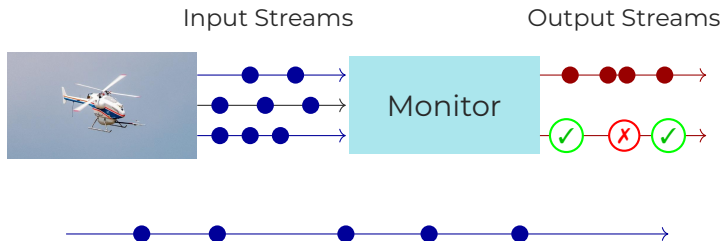
tasks become overdue
after deadline

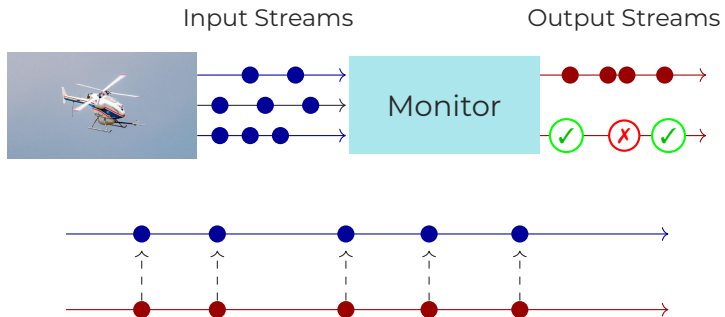


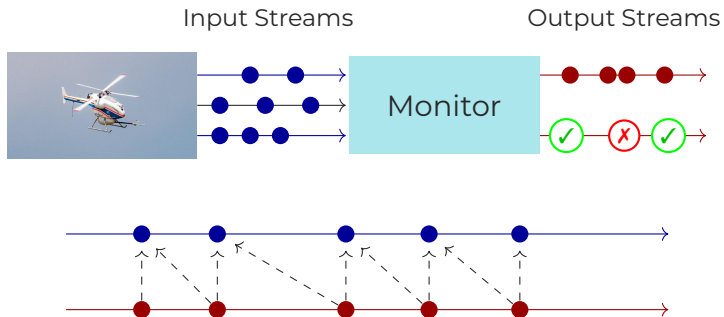


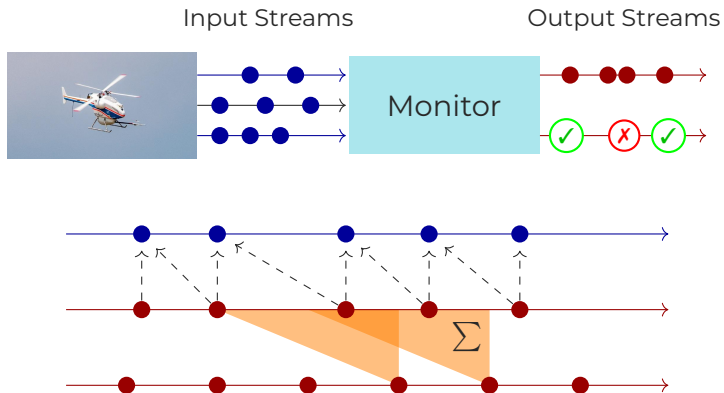






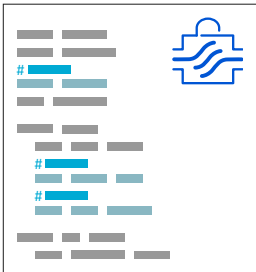






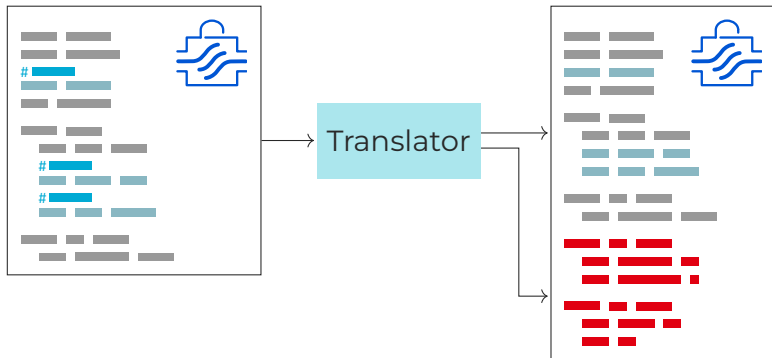


Overview



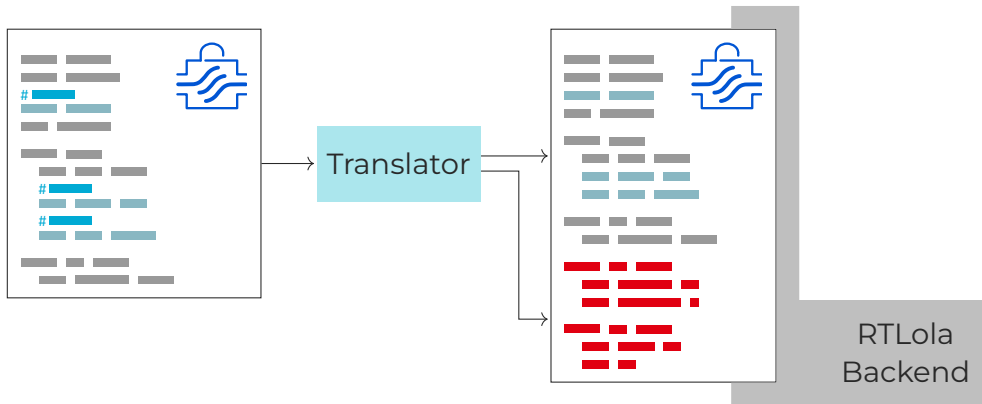


Overview



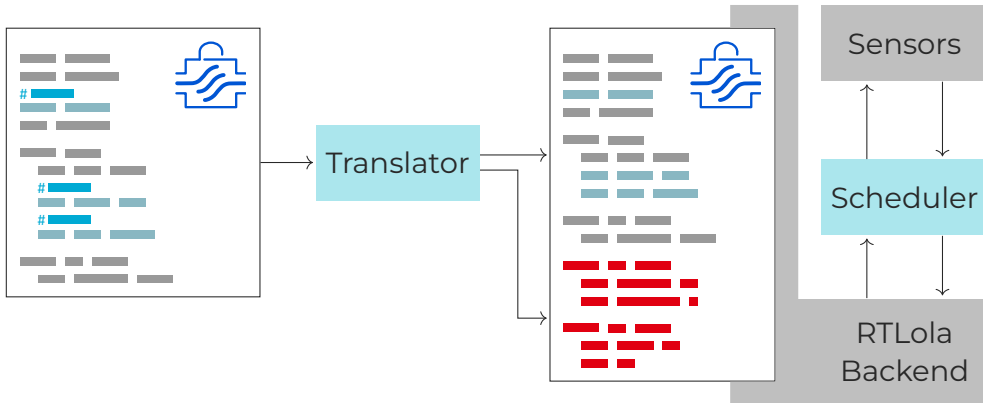


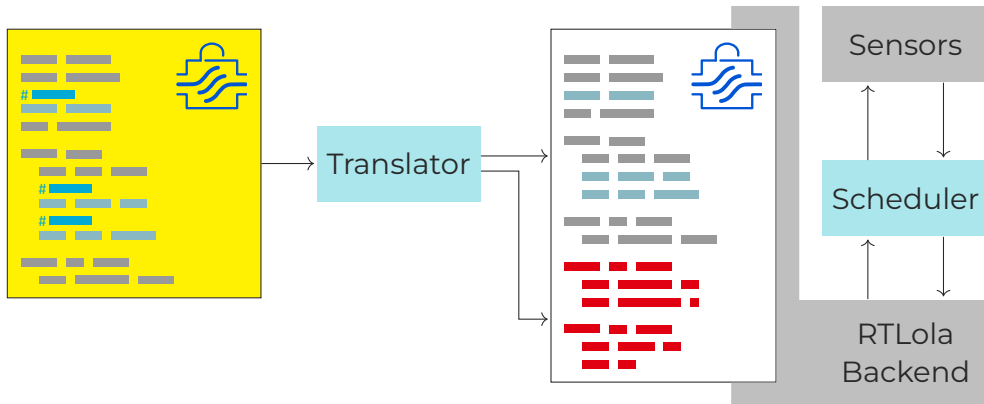
Overview





Overview







Scheduling Annotations

```
output dist @lat^lon := ...
output dist_violation
  #[priority=low]
  eval @lat^lon when dist < 20.0
    with false
  #[priority=medium]
  eval @lat^lon when dist < 50.0
    with false
  #[priority=high]
  eval @lat^lon when true
    with dist > 70.0
```



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Tasks $\rightarrow \mathcal{P}(\text{Cond} \times \mathbb{V})$



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Tasks $\rightarrow \mathcal{P}(\text{Cond} \times \mathbb{V})$

@lat^lon	
dist < 20	low



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Tasks $\rightarrow \mathcal{P}(\text{Cond} \times \mathbb{V})$

@lat^lon	
dist < 20	low
$20 \leq \text{dist} < 50$	medium



Scheduling Annotations

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Tasks $\rightarrow \mathcal{P}(\text{Cond} \times \mathbb{V})$

@lat^lon	
dist < 20	low
$20 \leq \text{dist} < 50$	medium
dist ≥ 50	high



Scheduling Annotations

```
output dist @lat^lon := ...
```

```
output dist_violation
```

```
eval @lat^lon when dist < 20.0  
    with false
```

```
eval @lat^lon when dist < 50.0  
    with false
```

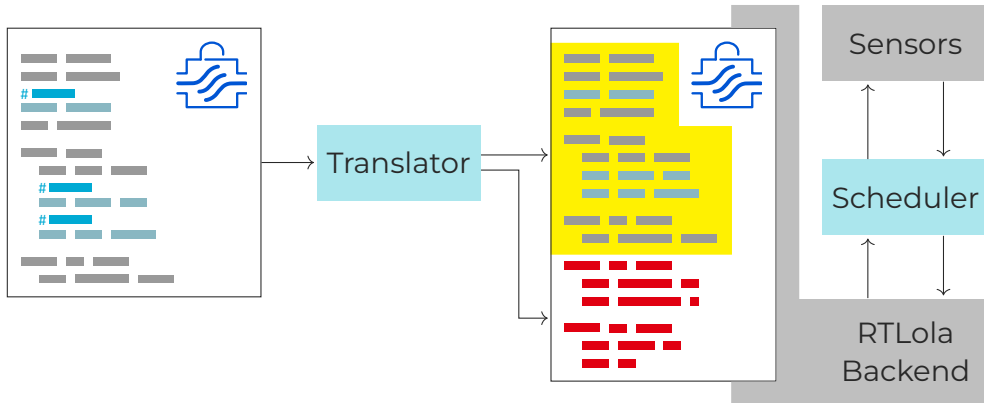
```
eval @lat^lon when true  
    with dist > 70.0
```

Tasks $\rightarrow \mathcal{P}(\text{Cond} \times \mathbb{V})$

@lat^lon	
dist < 20	low
$20 \leq \text{dist} < 50$	medium
dist ≥ 50	high



Overview





Additional Streams

@lat\lon	
dist < 20	low
$20 \leq \text{dist} < 50$	medium
dist ≥ 50	high



Additional Streams

separate stream
for each task

@lat^lon	
dist < 20	low
$20 \leq \text{dist} < 50$	medium
dist ≥ 50	high

```
output schedule_lat^lon
  eval @lat^lon when dist  $\geq 50$  with high
  eval @lat^lon when  $20 \leq \text{dist} < 50$  with medium
  eval @lat^lon when dist < 20 with low
```



Additional Streams

separate stream
for each task

@lat^lon	
dist < 20	low
20 ≤ dist < 50	medium
dist ≥ 50	high

```
output schedule_lat^lon
```

```
eval @lat^lon when dist ≥ 50 with high
```

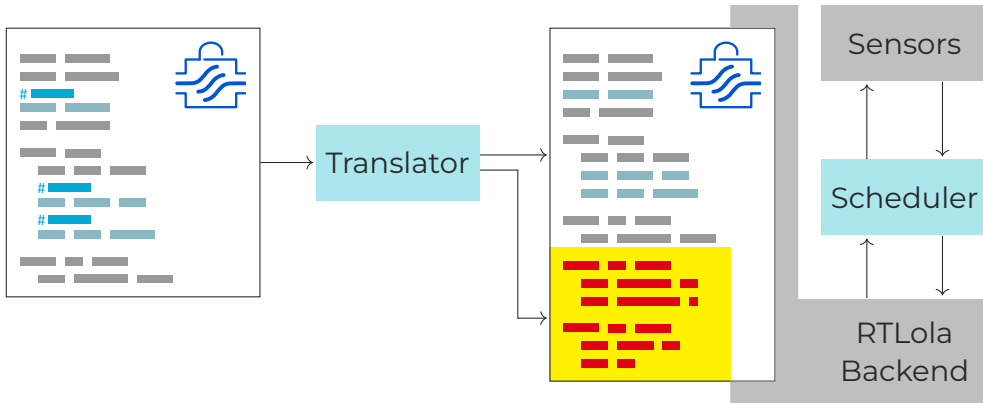
```
eval @lat^lon when 20 ≤ dist < 50 with medium
```

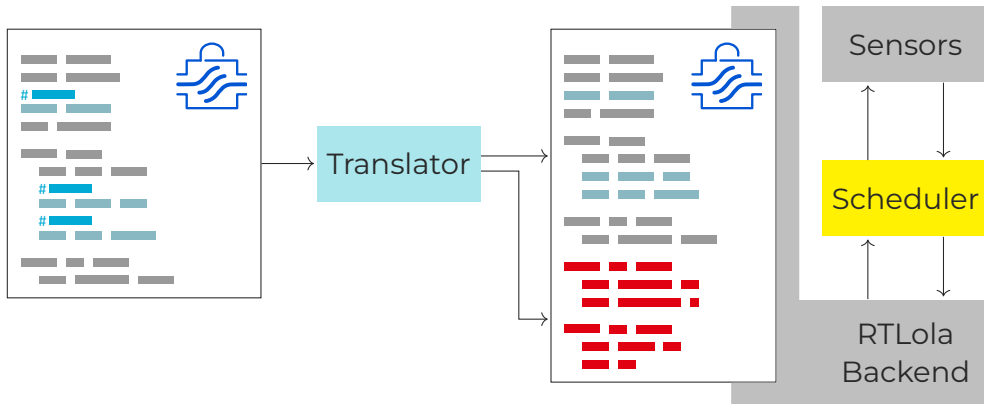
```
eval @lat^lon when dist < 20 with low
```

} sorted
descendingly



Overview







Scheduling Algorithms

Tasks $\rightarrow \mathcal{P}(\text{Cond} \times \mathbb{V})$

Deadline

Priority

Priority + Deadline



Scheduling Algorithms

Tasks $\rightarrow \mathcal{P}(\text{Cond} \times \mathbb{V})$

Deadline

Priority

Priority + Deadline

Fill available bandwidth
with tasks that are due
the soonest
(Earliest Deadline First)



Scheduling Algorithms

Tasks $\rightarrow \mathcal{P}(\text{Cond} \times \mathbb{V})$

Deadline

Fill available bandwidth
with tasks that are due
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(Earliest Deadline First)

Priority

Fill available bandwidth
with highest priority
tasks

Priority + Deadline



Scheduling Algorithms

Tasks $\rightarrow \mathcal{P}(\text{Cond} \times \mathbb{V})$

Deadline

Fill available bandwidth
with tasks that are due
the soonest

(Earliest Deadline First)

Priority

Fill available bandwidth
with highest priority
tasks

Priority + Deadline

Overdue tasks are
assigned new, highest
priority

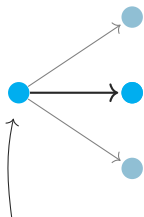


Getting stuck





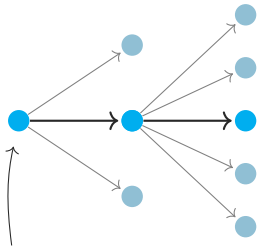
Getting stuck



Scheduling options based
on current monitor state



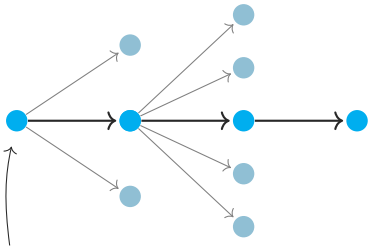
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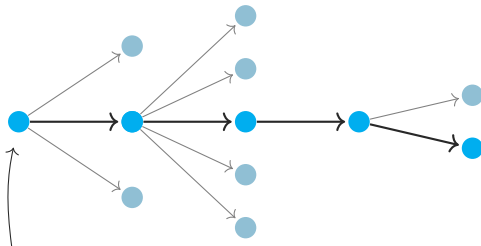
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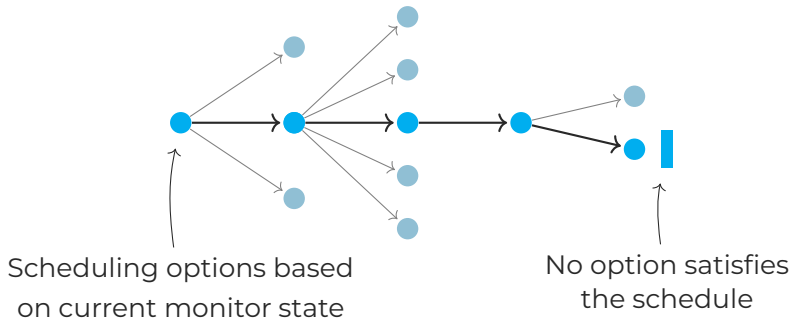
Getting stuck



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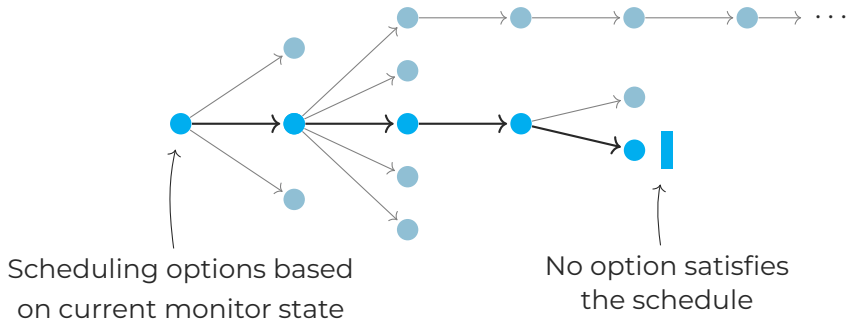


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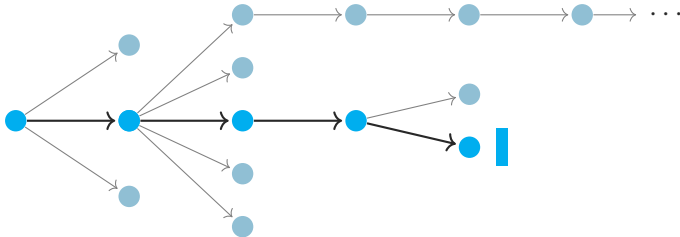


Getting stuck





Getting stuck



A scheduling algorithm should always be able to continue, independent of the future inputs!

► **Checked by static analysis on the constraint**



Evaluation

- Can we detect triggers earlier while using the same bandwidth?



Evaluation

- Can we detect triggers earlier while using the same bandwidth?
- Can we reduce bandwidth without compromising monitoring quality?



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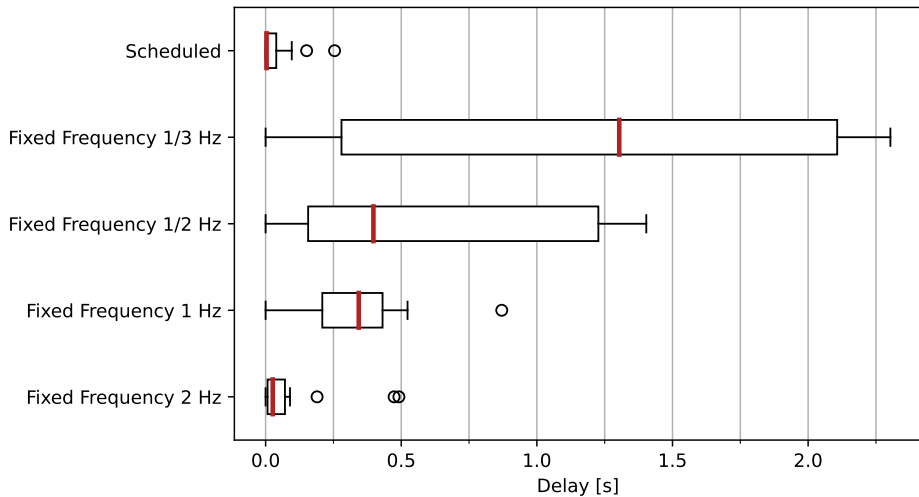
Evaluation with Microsoft AirSim [Sha+18]

- Compare scheduled monitor to multiple fixed-frequency monitors



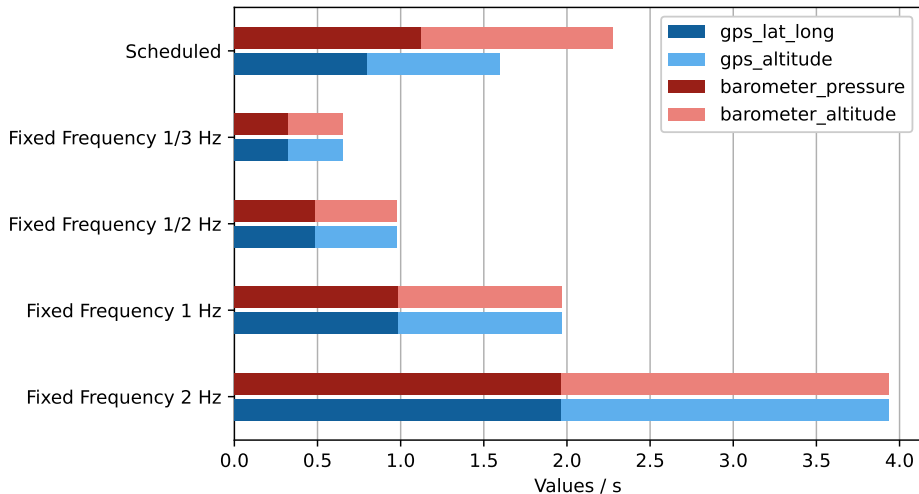


Trigger Delay Comparison



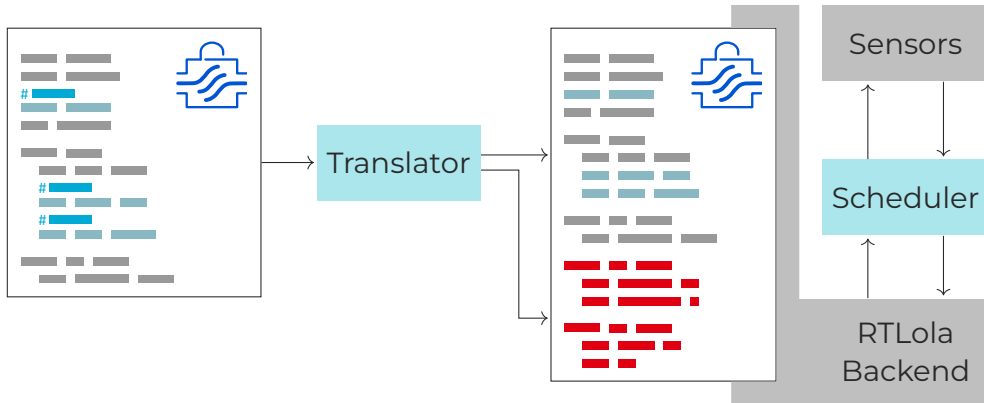


Average Bandwidth Comparison



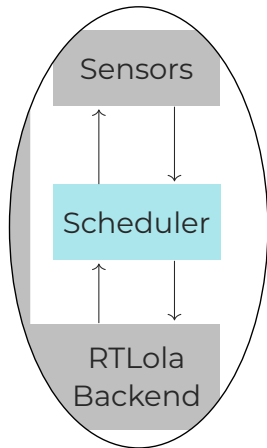


Conclusion & Outlook



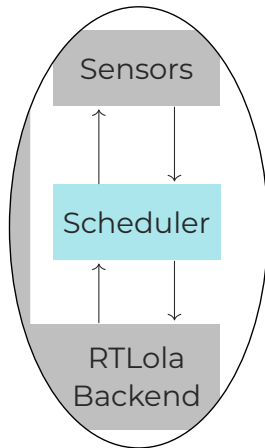
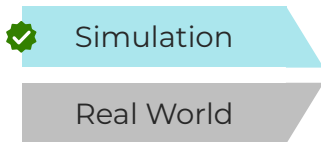


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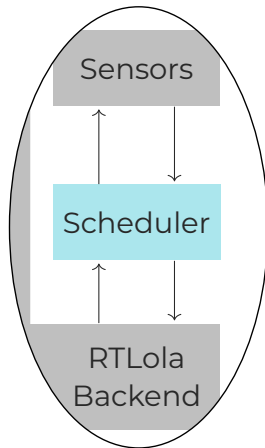


Conclusion & Outlook



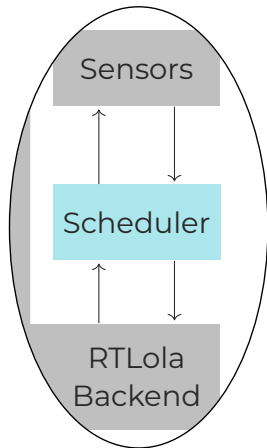
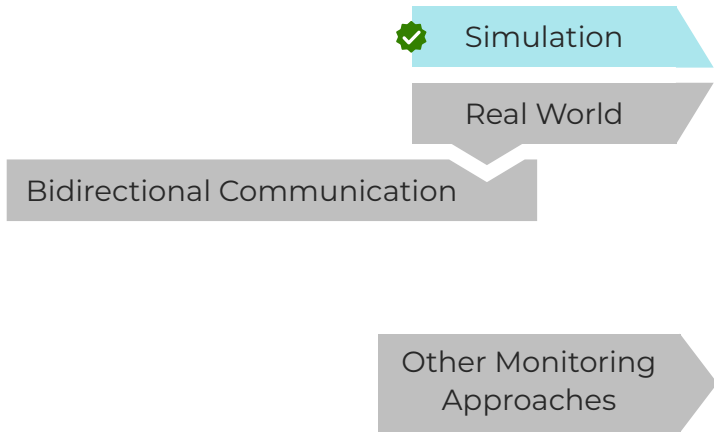


Conclusion & Outlook





Conclusion & Outlook



References

- [Sha+18] S. Shah, D. Dey, C. Lovett, and A. Kapoor. AirSim: High-Fidelity Visual and Physical Simulation for Autonomous Vehicles. In: Field and Service Robotics. Ed. by M. Hutter and R. Siegwart. Cham: Springer International Publishing, 2018, pp. 621–635. ISBN: 978-3-319-67361-5.