

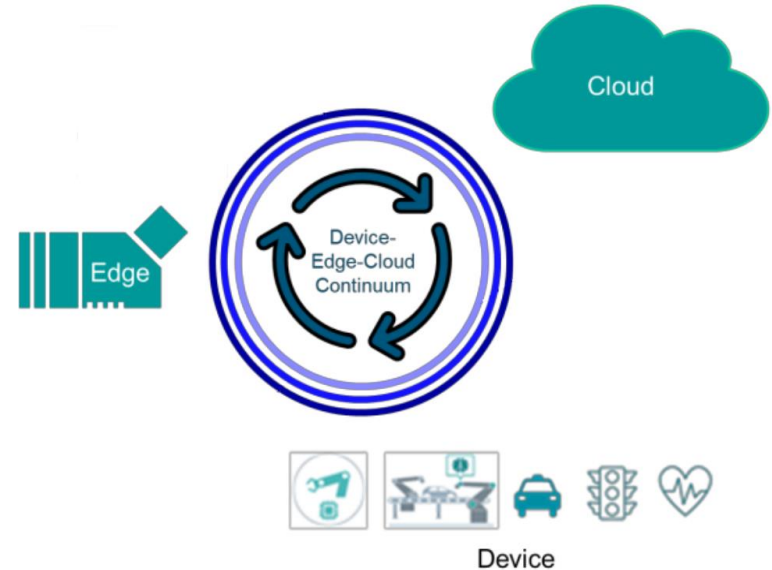
# Semantic Stream Processing on different Hardwares.

Anh Le-Tuan

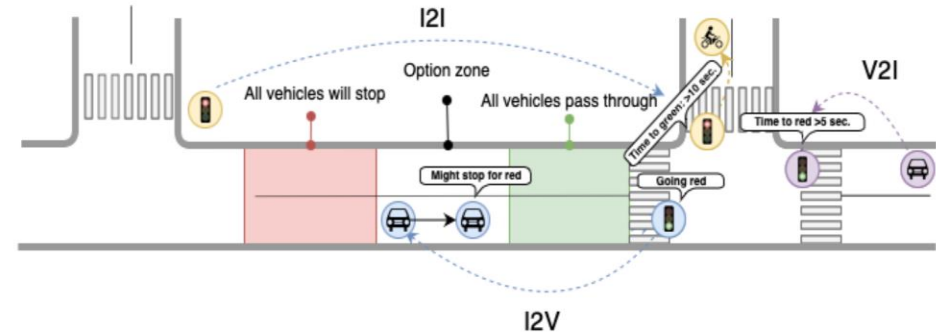
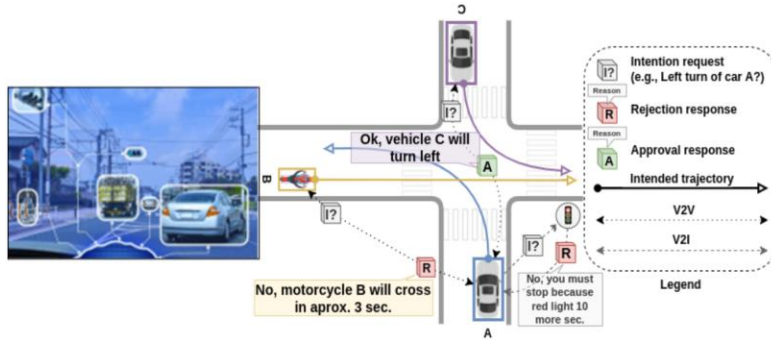
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# SMARTEDGE

- enable the **dynamic integration** of **decentralized intelligence** on the **cloud-edge continuum**.
- ensure **robustness**, **reliability**, **security**, **privacy** and **scalability**.

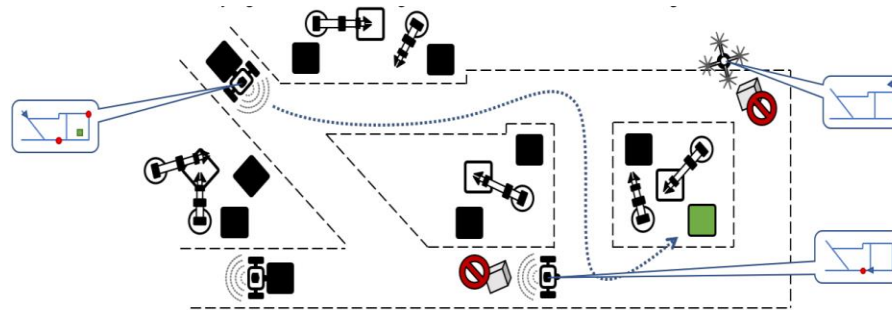


# SMARTEDGE Scenarios



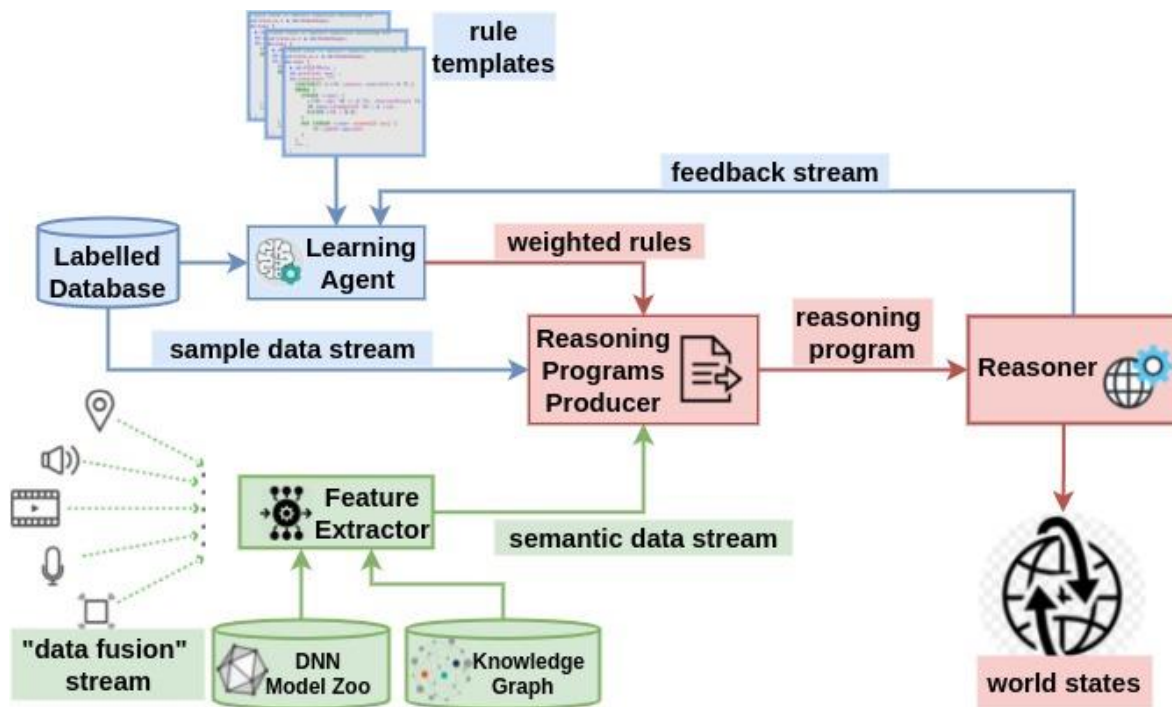
**Scenario 1:** Cooperative Perception for Driving Assist

**Scenario 2:** I2V Intelligence Swarm



**Scenario 3:** Collaborative Robotic Movers

# Semantic-driven Multimodal Stream Fusion Framework



Enable multimodal  
data stream fusion  
via probabilistic  
stream reasoning.

The overview of conceptual design of CQELS 2.0

# Challenges

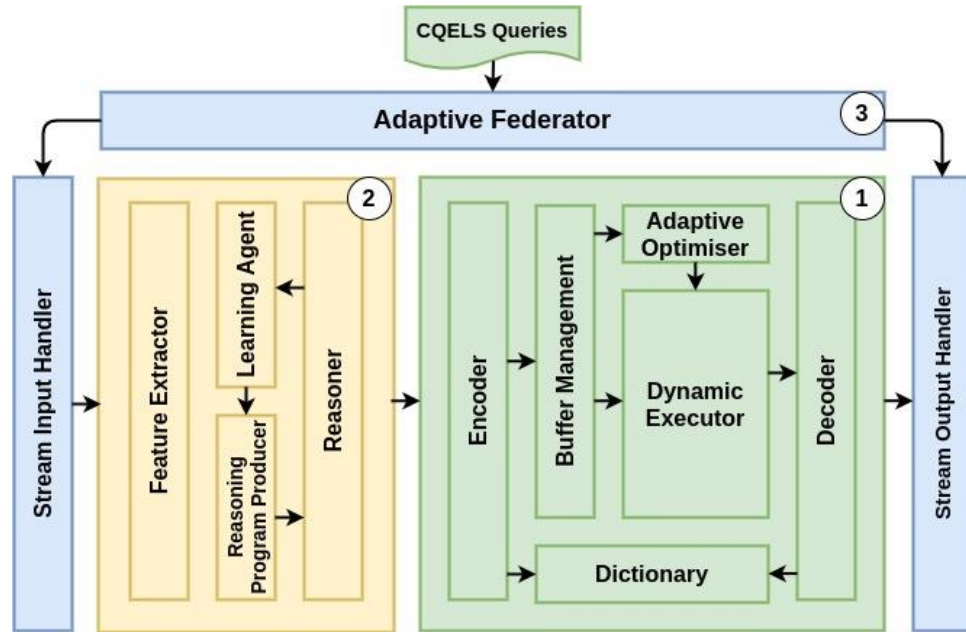
Write **once** run **everywhere** but :

- Scalable
- Low latency

# CQELS 2.0 Architecture

Three subsystems:

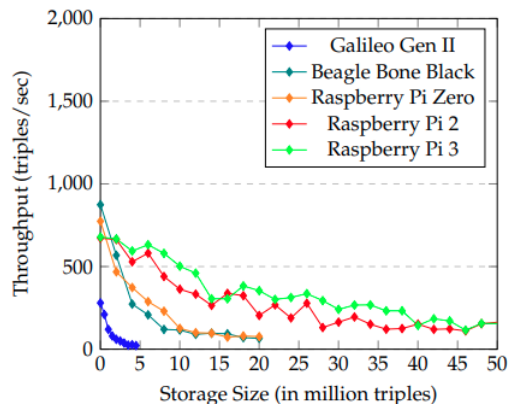
1. Semantic symbolic stream processor
2. Multimodal data stream feature extractor.
3. Adaptive federator.



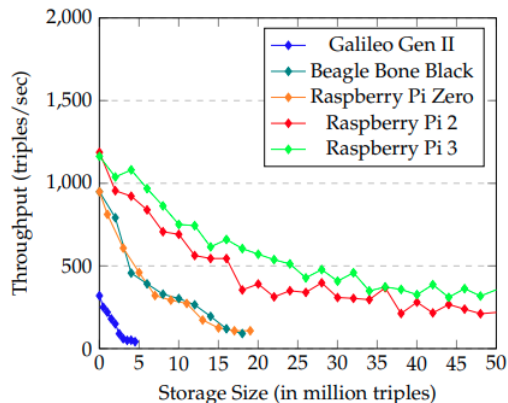
The overview of architecture of CQELS 2.0

Le-Tuan, A., Nguyen-Duc, M., Le, C. Q., Tran, T. K., Hauswirth, M., Eiter, T., & Le-Phuoc, D. (2022). CQELS 2.0: Towards A Unified Framework for Semantic Stream Fusion. *arXiv preprint arXiv:2202.13958*.

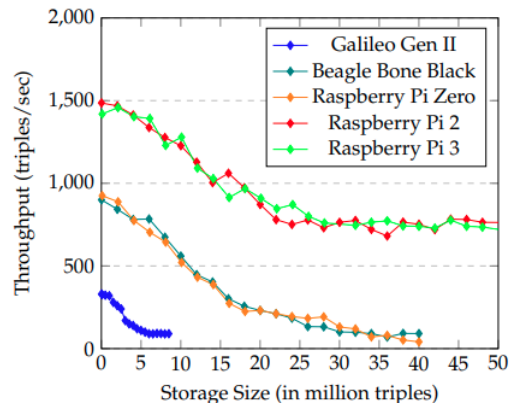
# I/O Bottleneck for flash storage of Edge devices



(a) JenaTDB



(b) RDF4J



(c) Virtuoso

|                      | Data Structure                   | Version |
|----------------------|----------------------------------|---------|
| Jena TDB             | B <sup>+</sup> tree<br>LRU Cache | 3.14.0  |
| RDF4J Native Store   | BTree                            | 3.1.0   |
| Virtuoso Open-Source | B <sup>+</sup> Tree              | 6.1.8   |

|                           | RAM    | CPU               |
|---------------------------|--------|-------------------|
| Galileo II (GII)          | 256 MB | 0.4 GHz           |
| Raspberry Pi Zero (RPi0)  | 512 MB | 1.0 GHz           |
| Raspberry Pi Zero W (BBB) | 512 MB | 1.0 GHz           |
| Raspberry Pi 2 B+ (RPi2)  | 1 GB   | 0.9 GHZ (4 cores) |
| Raspberry Pi 3 B+ (RPi3)  | 1 GB   | 1.2 GHZ (4 cores) |

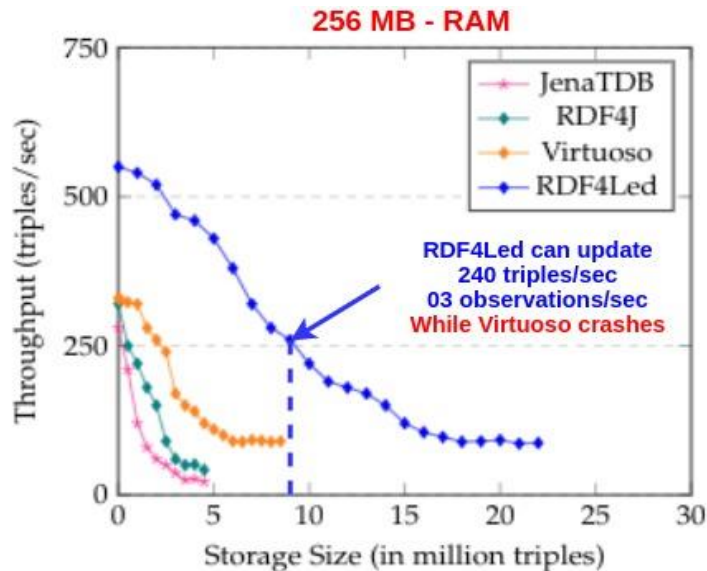
# Get risk of I/O bottleneck

- Optimize memory footprint.
- Flash-friendly I/O data structure.
- Cold Clean First – RLU replacement policy.

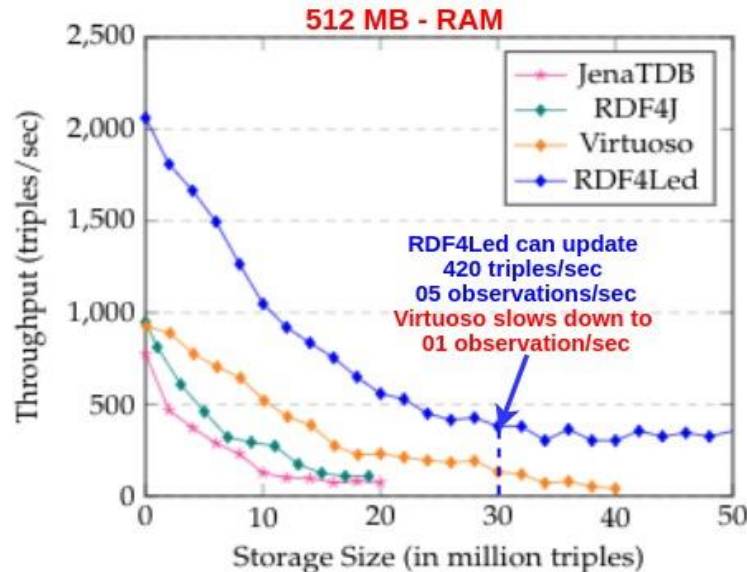
Le-Tuan, A., Hayes, C., Hauswirth, M., & Le-Phuoc, D. (2020). Pushing the scalability of RDF engines on IoT edge devices. *Sensors*, 20(10), 2788.



# RDF4LED - Write throughput

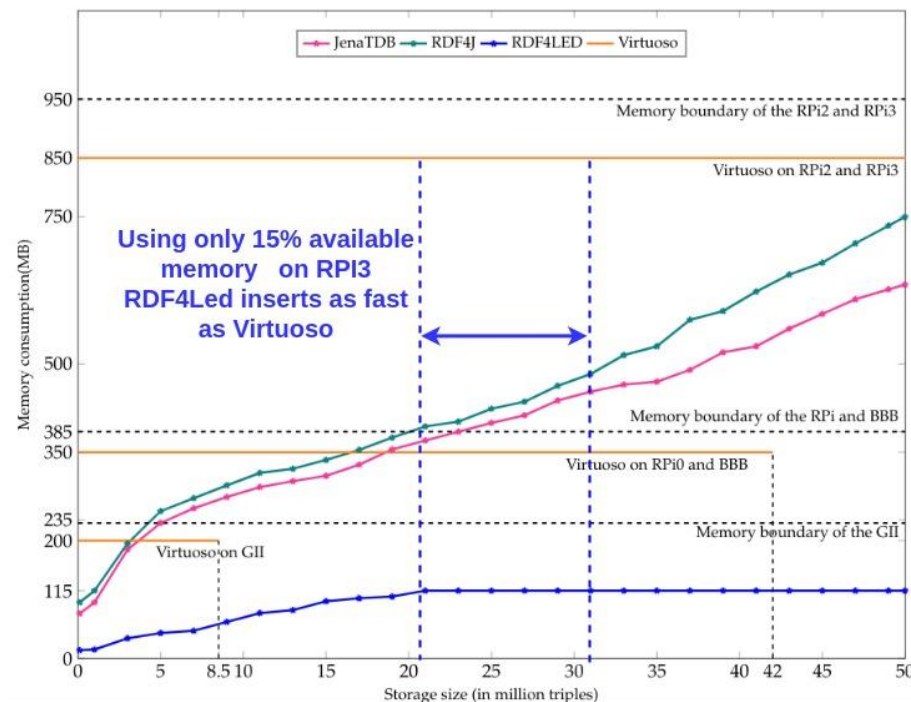
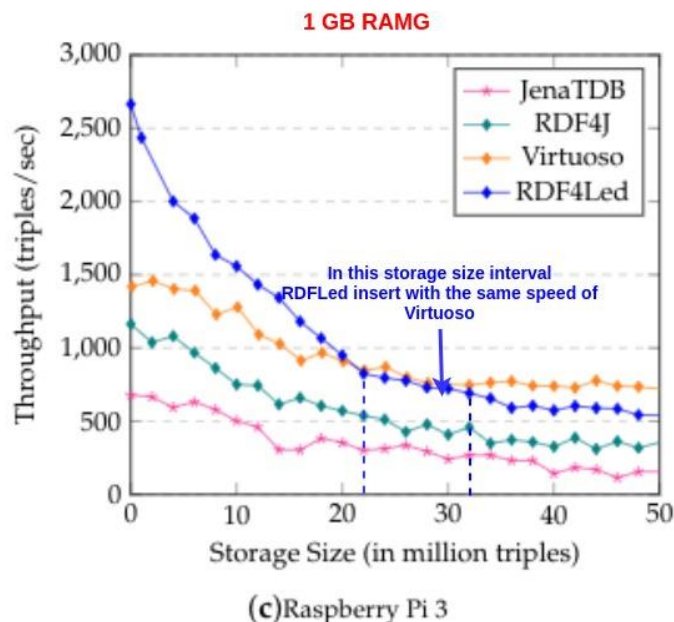


(a) Gallileo Gen II



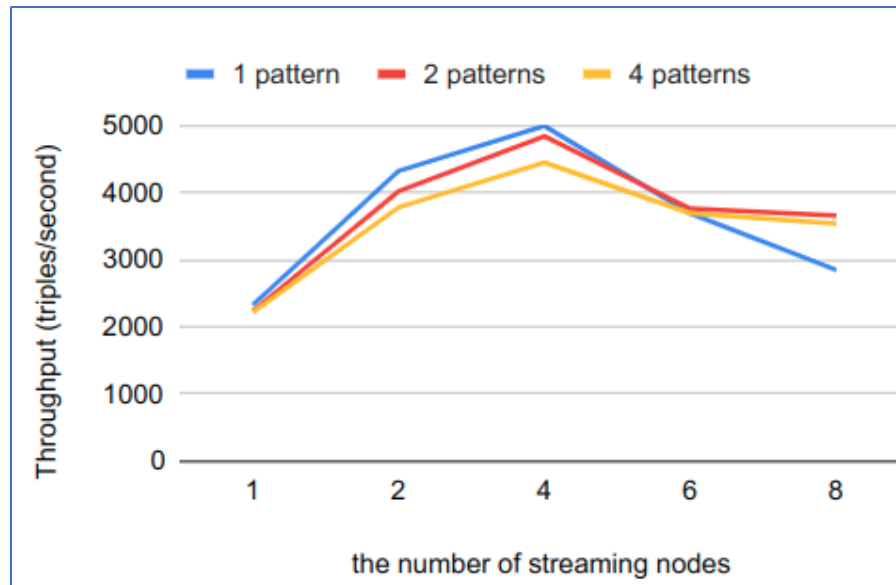
(b) Raspberry Pi Zero;

# RDF4Led – Write throughput and memory consumption



# Scaling out Issue

- Adding **more** nodes **increase** the through.
- Only adding **more** nodes does not.

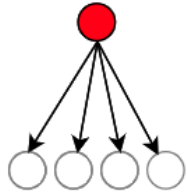


Nguyen-Duc, M., Le-Tuan, A., Calbimonte, J. P., Hauswirth, M., & Le-Phuoc, D. (2020). Autonomous RDF stream processing for IoT edge devices. In *Joint International Semantic Technology Conference*.

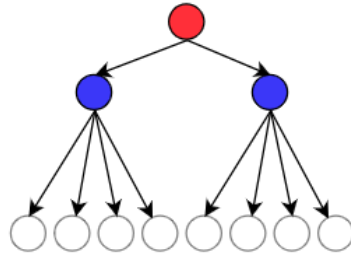
# Scaling out Issue

- How to coordinate?
- Where to place processing operators.

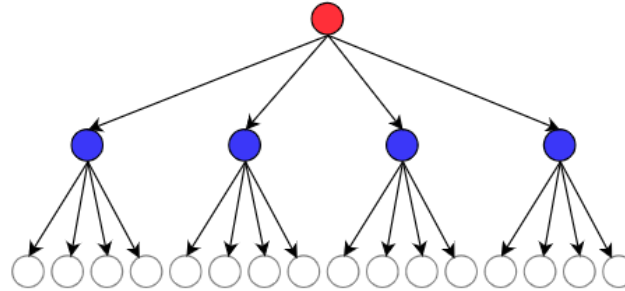
# Setup topologies



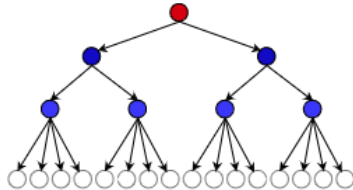
(a) 1 node (1-hop)



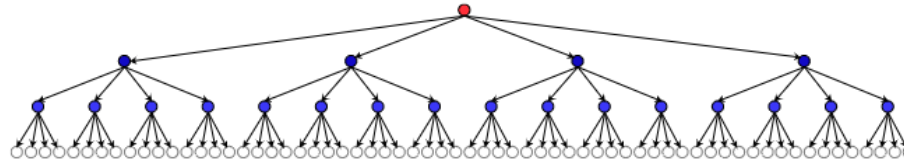
(b) 3 nodes (2 hop, 2-fanout)



(c) 5 nodes (2 hop, 4-fanout)

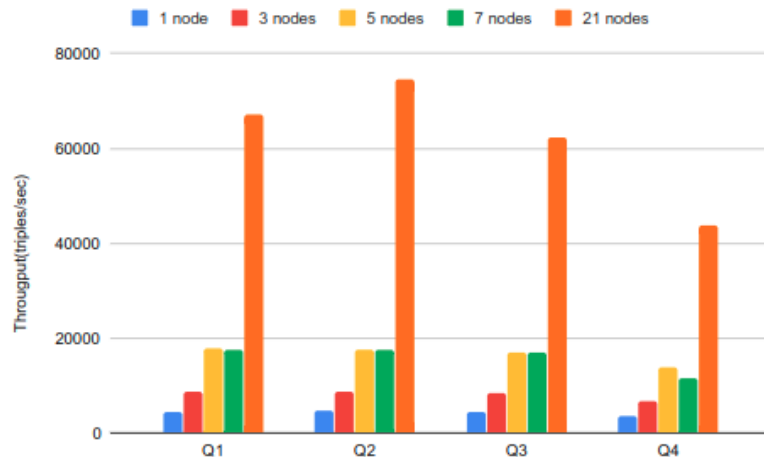


(d) 7 nodes (3-hop, 2-fanout)

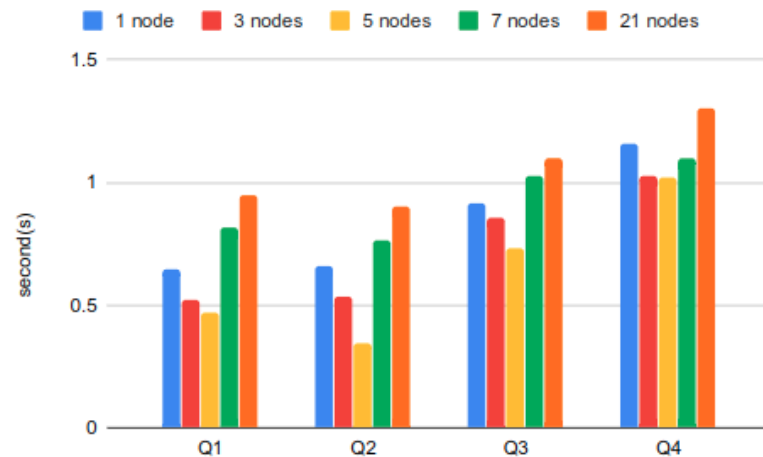


(e) 21 nodes (3-hop, 4-fanout)

# Distributed Stream results

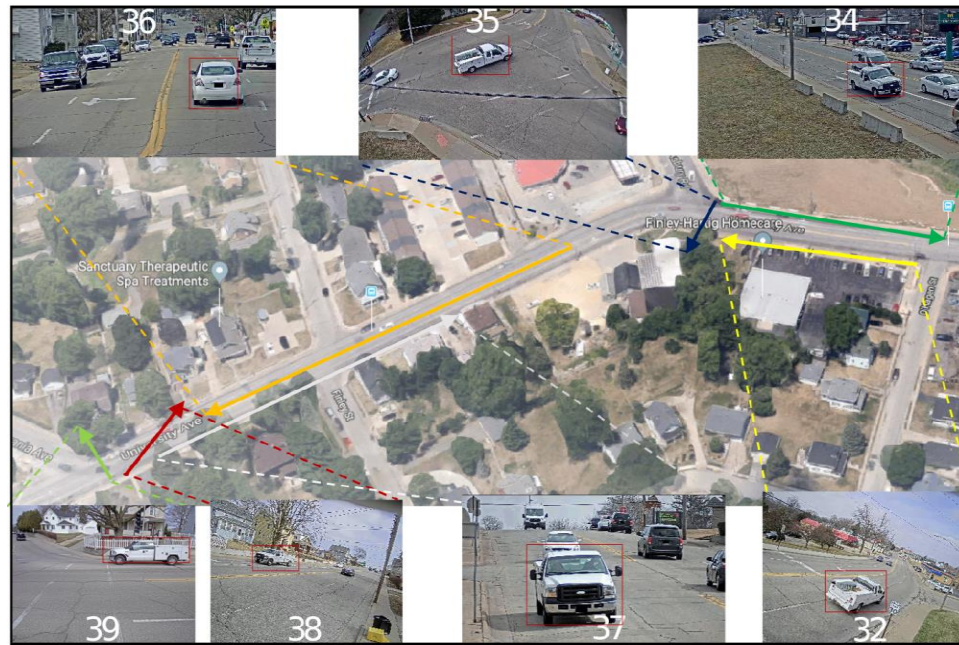
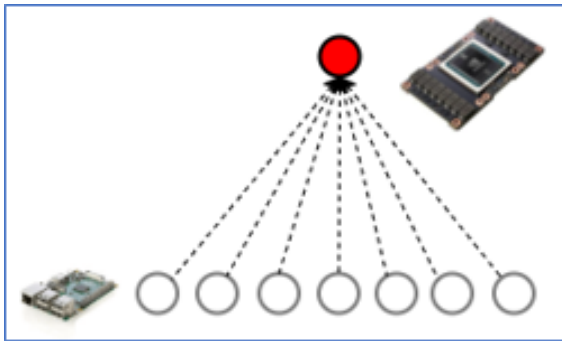
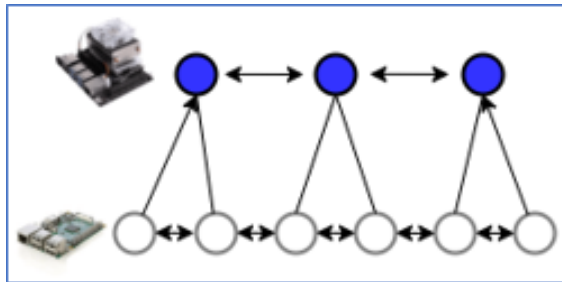


(a) Processing Throughput



(b) Average Processing Time

# Offloading feature extraction

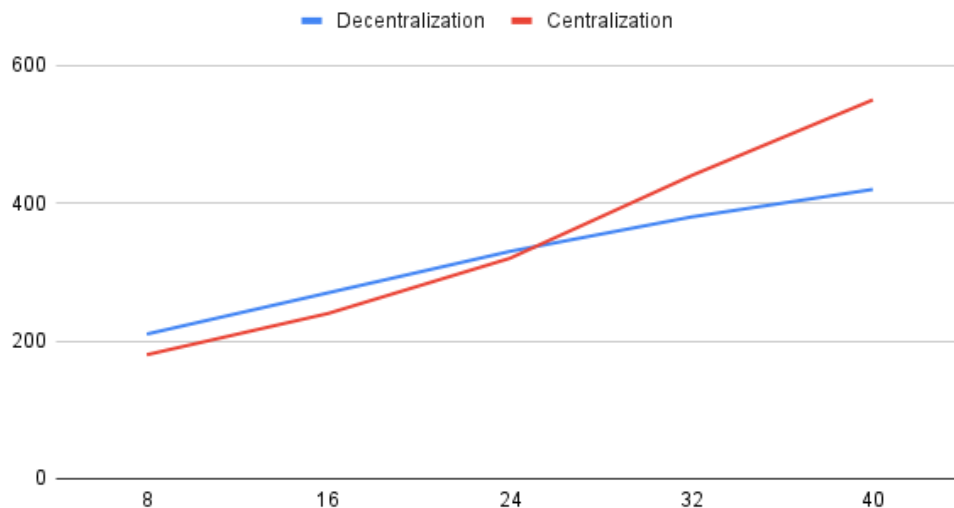


Nguyen-Duc, M., Le-Tuan, A., Hauswirth, M., & Le-Phuoc, D. (2021, June). Towards autonomous semantic stream fusion for distributed video streams. In *Proceedings of the 15th ACM International Conference on Distributed and Event-based Systems* (pp. 172-175).

# Traffic camera edge network

|           | 8 x Jetson Nano                          | 2 x Server                 |
|-----------|--|----------------------------|
| RAM       | 8 x 4GB                                  | 2x 1TB RAM                 |
| CPU       | 8 x Quadcore ARM Cortex-A57              | 2x 10 physical cores       |
| GPU       | NVIDIA Maxwell<br>128 NVIDIA CUDA cores. | 2 x NVIDIA Tesla V100 16GB |
| Inference | 8x 15-17fps                              | 2 x 250 fps                |

Centralization and Decentralization





# Open Issue

Accelerating Execute Engine with different factors:

- Faster indexing:
  1. On multiple type of storage : DDR2 RAM, GPU RAM, flash, SSD, HDD
  2. On different processing hardwares: Intel, arm, snapdragon, Nvidia, ...
- Integrating ML or DNN components/models engine: Pytorch, DL2/D4JL, TensorFlow/TensorLight,

# Open Issue

- Better Coordination:
  1. Communication: Networking, Topology, Bandwidth,
  2. Operator placement
  3. Resource management.