



# COLOMBO

Cooperative Self-Organizing System for low  
Carbon Mobility at low Penetration Rates

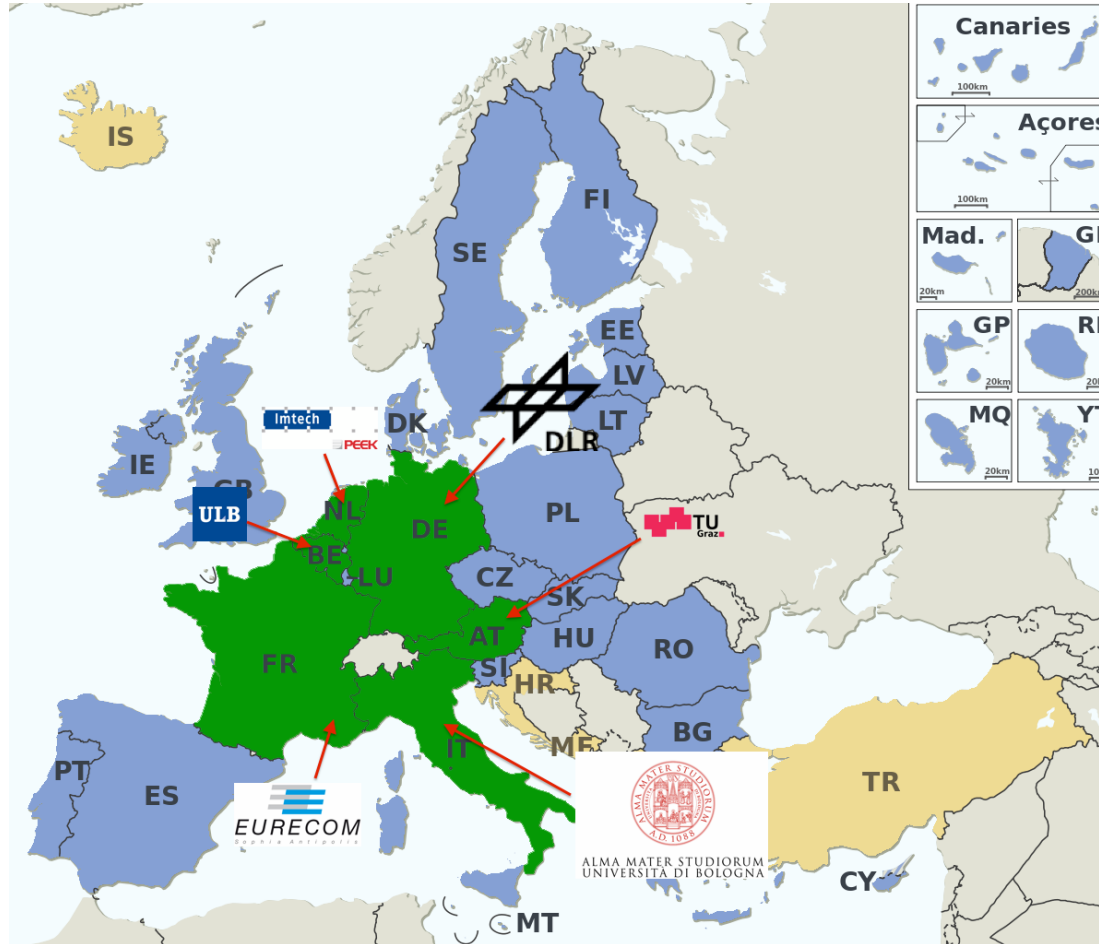
## Swarm-based Controller for Traffic Lights Management

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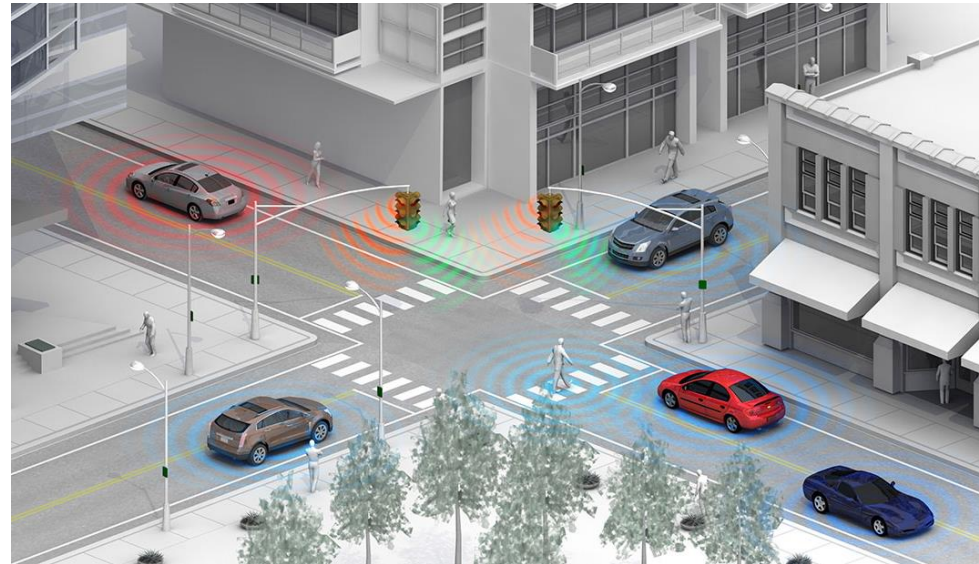
# COLOMBO consortium



# Main objective

Design and implement a self-organizing, adaptive, distributed and monitoring-aware approach to **traffic light control**

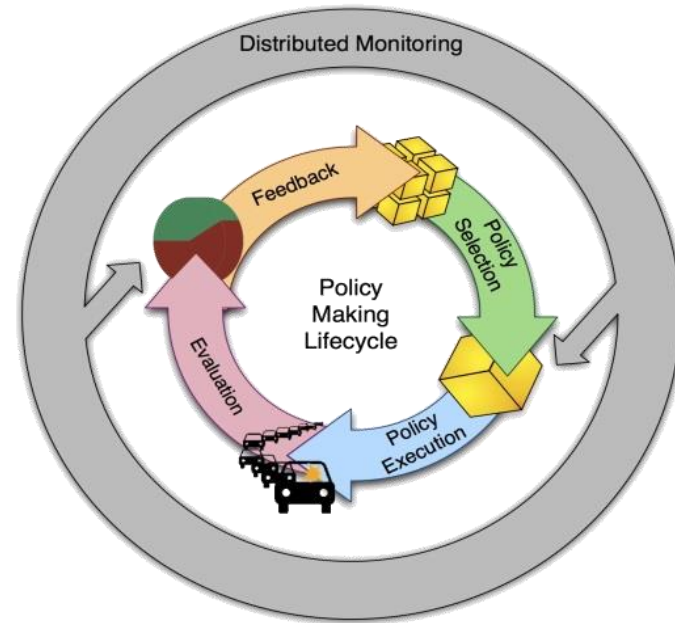
- Based on information coming from V2X communication
- Automatically selecting the proper policy
- Receiving feedback on its choice
- Automatically tuned



## Self-organizing traffic light control: the concept

### Control Loop

- Sensing
- Policy selection
- Policy execution
- Evaluation
- Feedback



We developed the **Swarm controller** based on swarm intelligence concepts

## Traffic light controller policies

- Different traffic situations need different policies
  - ➔ Policy specialization
    - Low traffic
    - High traffic
    - Not homogeneous traffic
    - Congestions & burst
- Selection of the lanes and the length of the green phase

# Pheromone

- **Pheromone** abstracts traffic conditions
- Every car leaves a **virtual pheromone trail** on the road
- Pheromone proportional to the **level of congestion**
- More robust than simply counting vehicles (w.r.t. incomplete information)

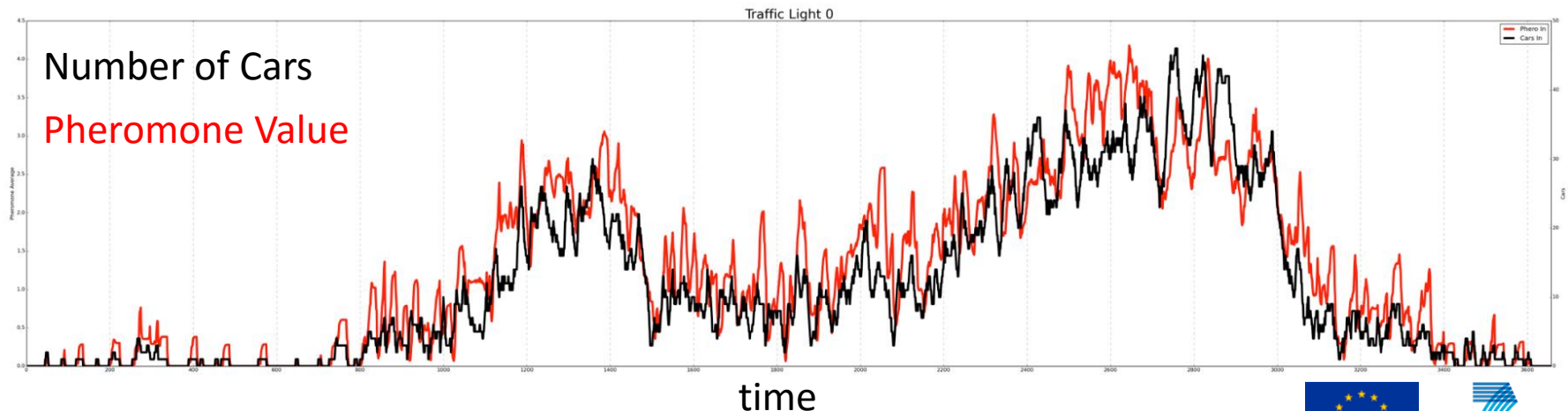


## Pheromone

The pheromone computation relies on the **average speed** and its derivative (**acceleration**) of the vehicles.

$$f_i(k+1) = \beta f_i(k) + \gamma v(l, k); f_i(0) = 0$$

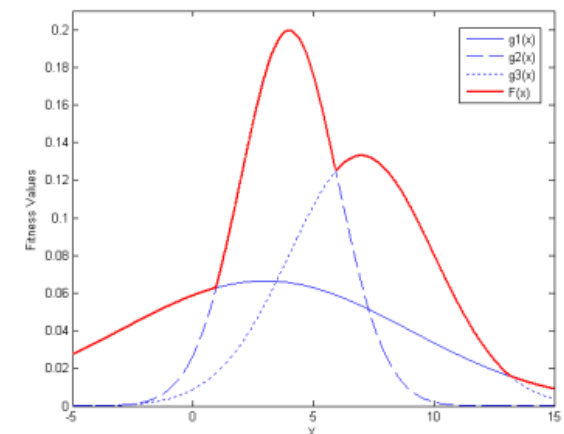
$$v(l, k) = \frac{\text{MaxSpeed}(l) - \text{MeanVehicleSpeed}(l, k)}{\frac{d\text{MeanVehicleSpeed}(l, k)}{dk}}$$



## Policy selection

- **Specialized policies** for every traffic conditions
- The controller is pushed to **chose a policy**
- Probabilistic selection
- Each policy has its own stimulus function
- The **stimulus functions** are represented by a set of Gaussians in the pheromone space

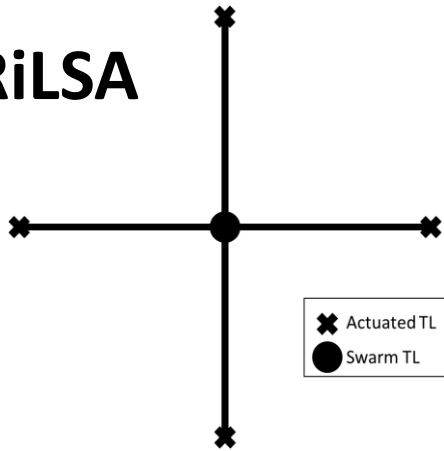
$$s_{i,j}: [0, f_{max}] \times [0, f_{max}] \rightarrow \mathbb{R}^+$$



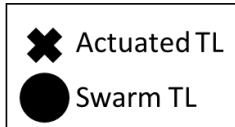
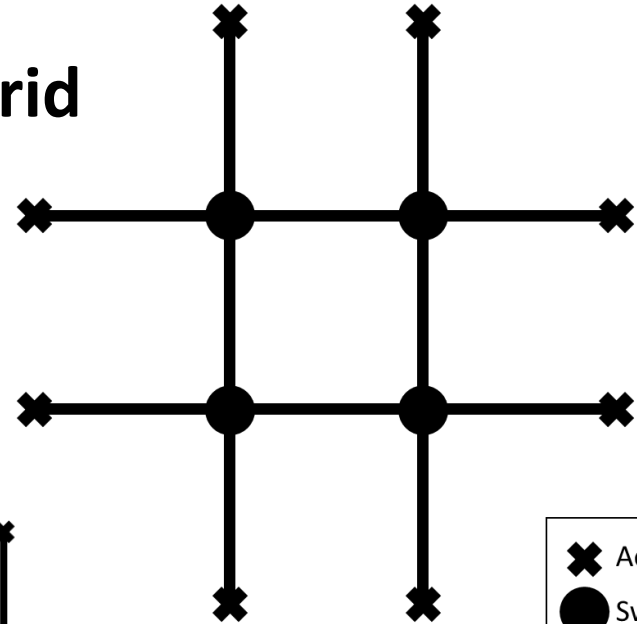


## Synthetic but realistic scenarios

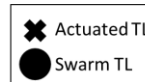
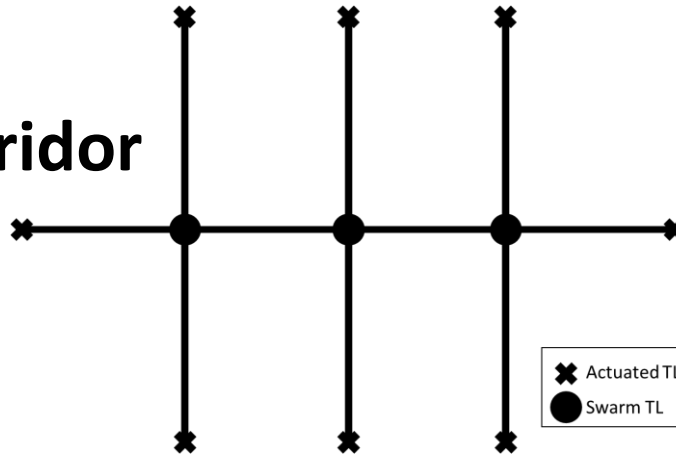
### RiLSA



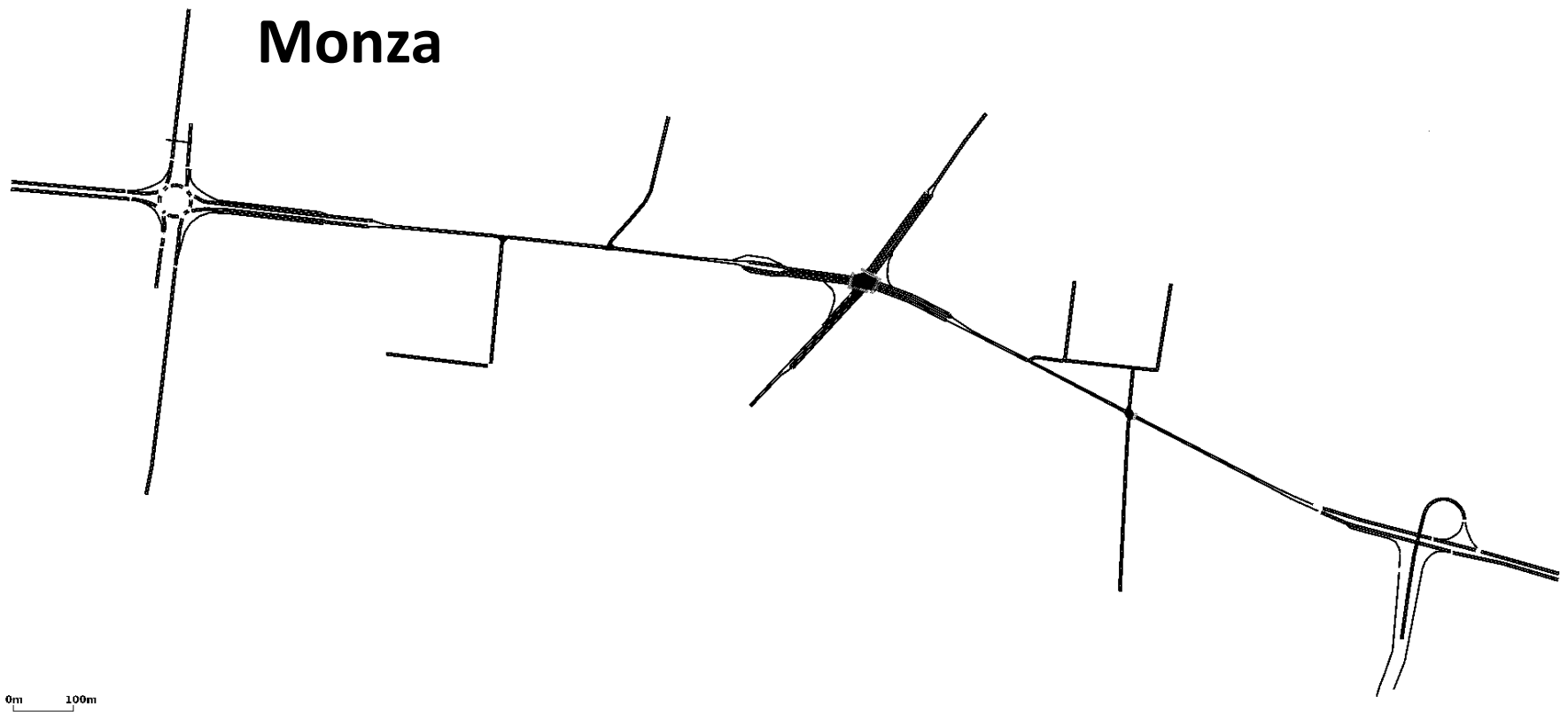
### Grid



### Corridor

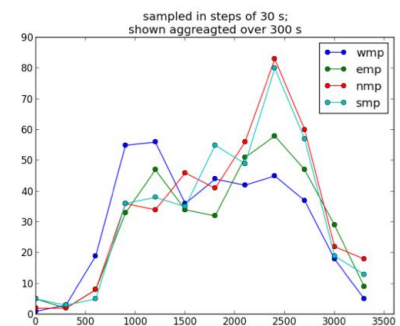
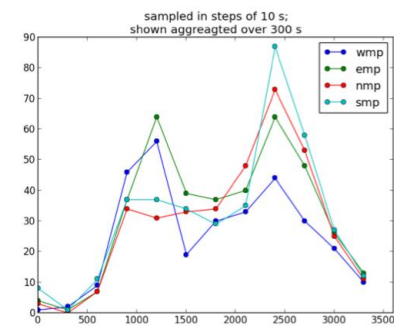
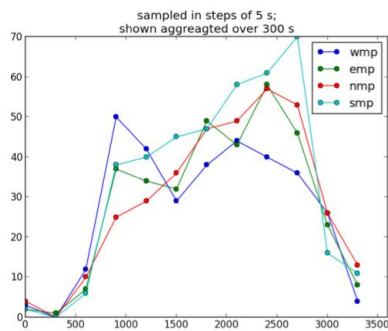
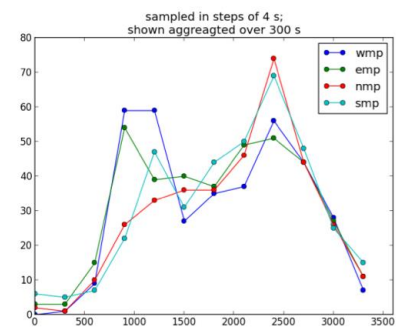
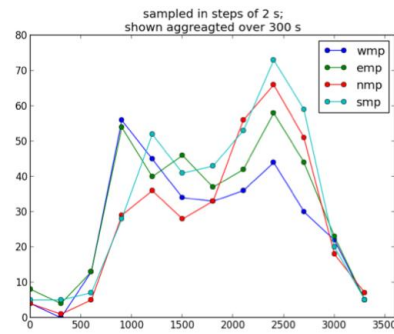
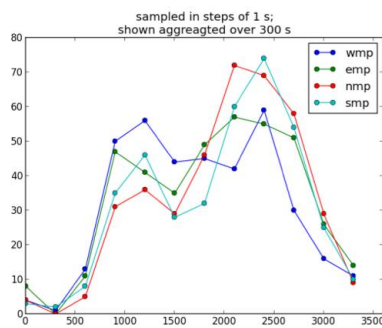


## Monza scenario: a real world example







## Realistic traffic conditions

### Considering realistic daily load curves



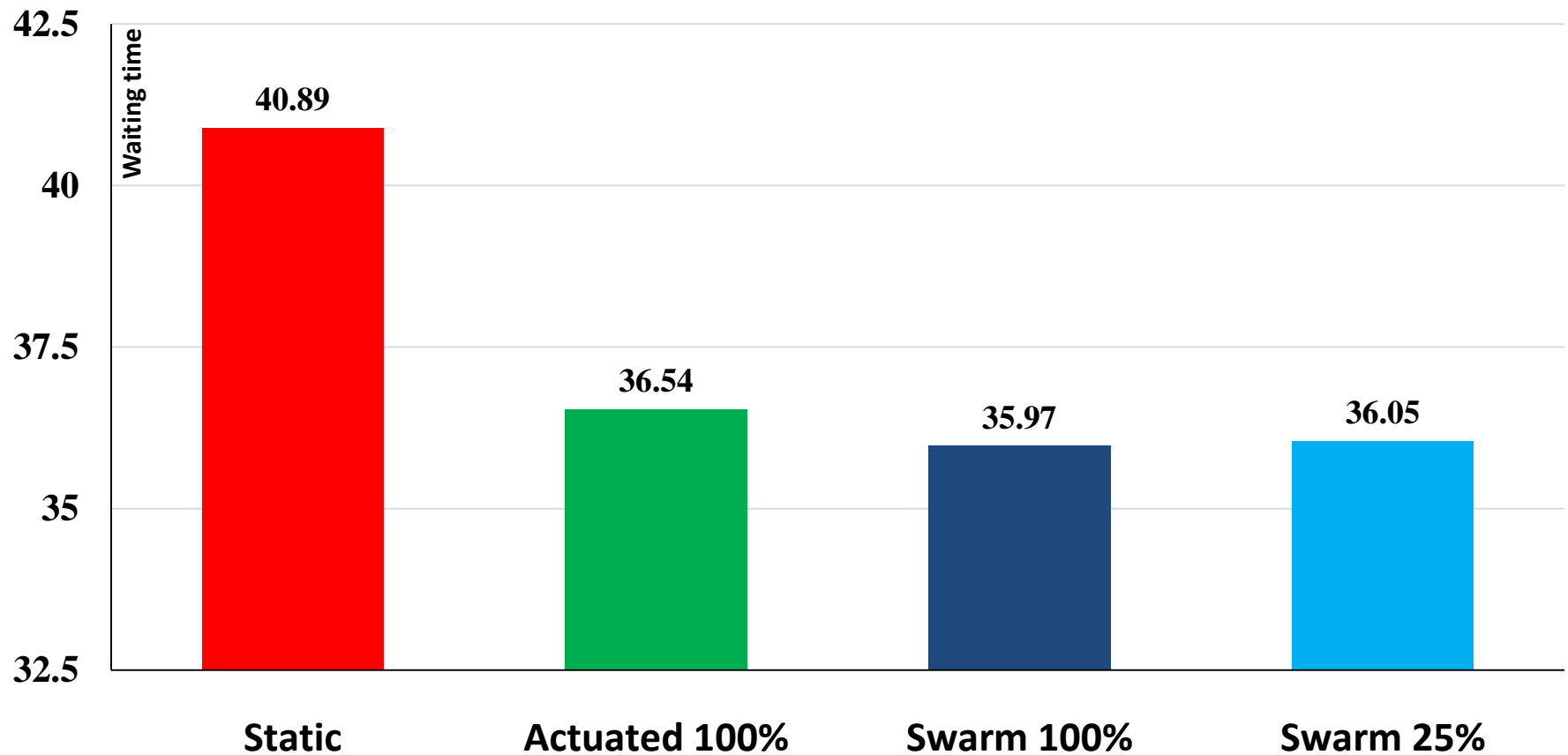
# Penetration Rate

Comparing the Swarm Controller With:

-  **Classic Static Controller**
-  **Actuated Controller (inductive loops knowledge → 100%)**
-  **Swarm Controller (inductive loops knowledge → 100%)**
-  **Swarm Controller (incomplete knowledge → 25%)**

Evaluation on the average waiting time

## Monza results



# Conclusions

- We developed a swarm based traffic light controller
- Extensive evaluations shows promising results
- The system has been extended to manage:
  - Pedestrian
  - Bicycles
  - Emergency vehicles
  - Public transport