



# PV-Alert: Vulnerable Road User Alert System With An Advanced Map Matching Algorithm In A Fog-based Architecture

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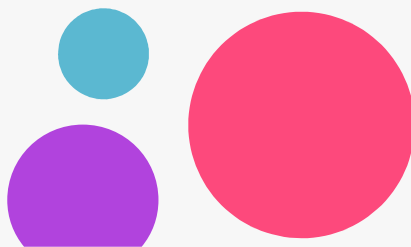
Presented by Aghiles DJOUDI  
ISAT/UPMC



**Pierre and Marie Curie University**

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# Motivation

Statistics of road accidents

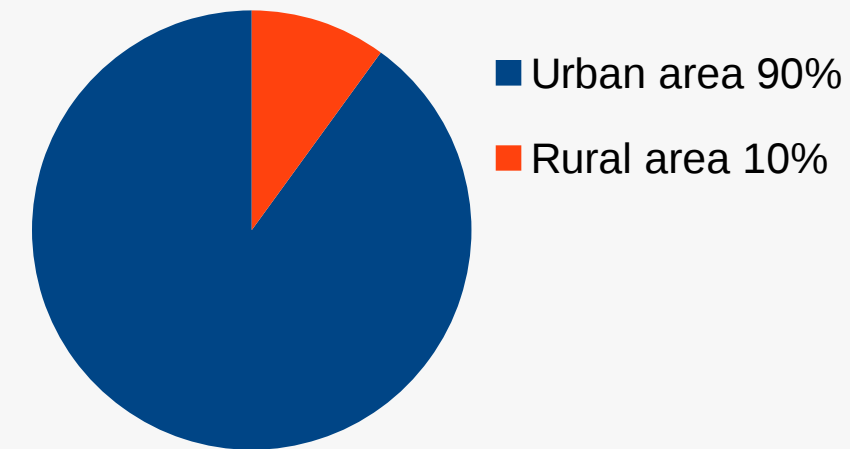
World Health Organization 2015:

*1.2 million*  
*injuries each year.*

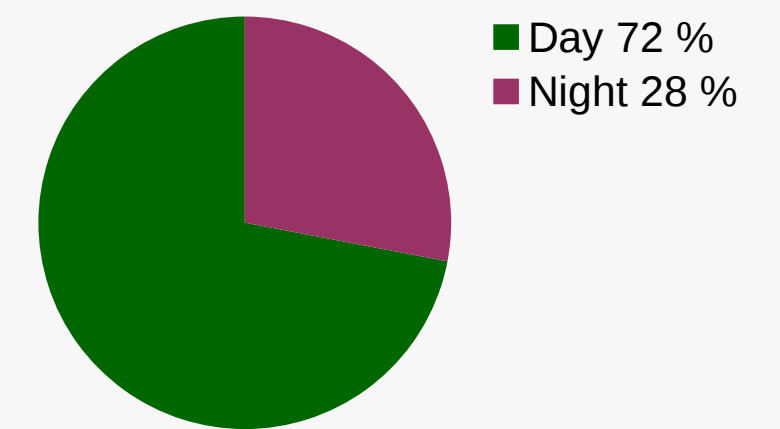
Category	2000	2010
Pedestrians	10.4 %	12.1 %
Cyclists	3.3 %	3.7 %
Cyclo-motoristes	5.6 %	6.2 %
Motorcyclists	11.6 %	17.6 %

*Distribution of fatal road accidents according to different users categories*

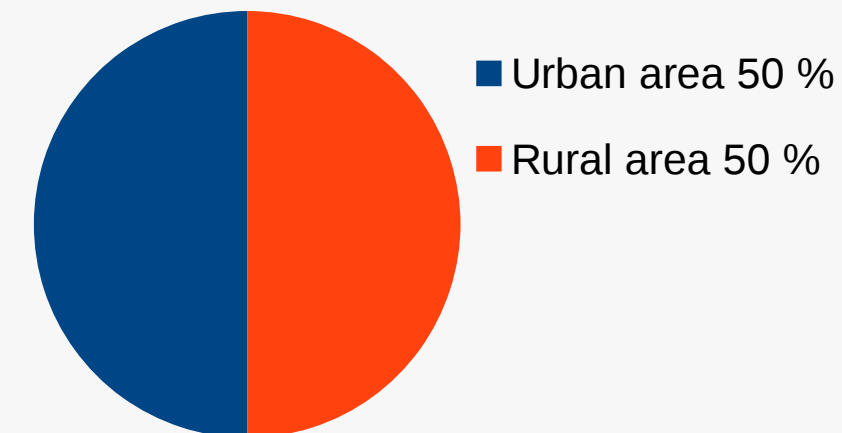
*The French Road Safety Observatory (ONISR)*



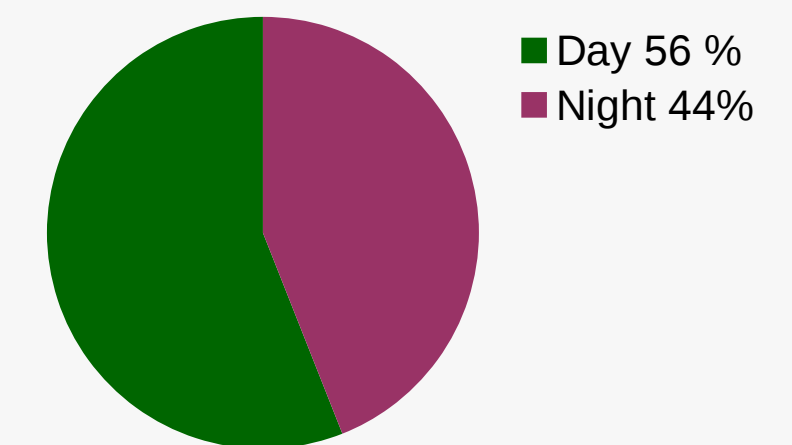
*Accidents by external environment.*



*Accidents by time of day*



**Fatal** *accidents by external environment.*

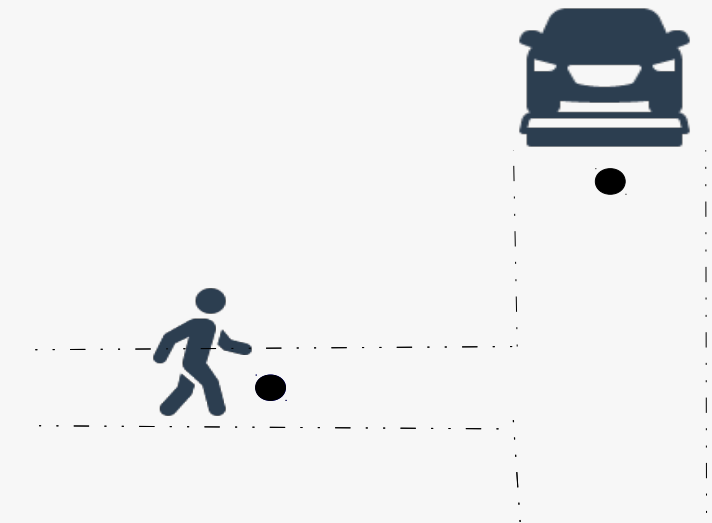


**Fatal** *accidents by time of day*



# State of art

*3 projects, 3 different technologies*



## 1) Systems based on radars

European projects: **PROTECTOR** and **SAVE-U**

Design a pedestrian protection systems based on multi-sensors: **Radars**, **Cameras** and **Laser sensors**

## 2) Systems based on visual or infrared sensors

French project: “**Logiciels d’observation des usagers vulnérables**”

Design a pedestrian perception systems based on: **Laser sensors**, **monovision** and **stereovision**

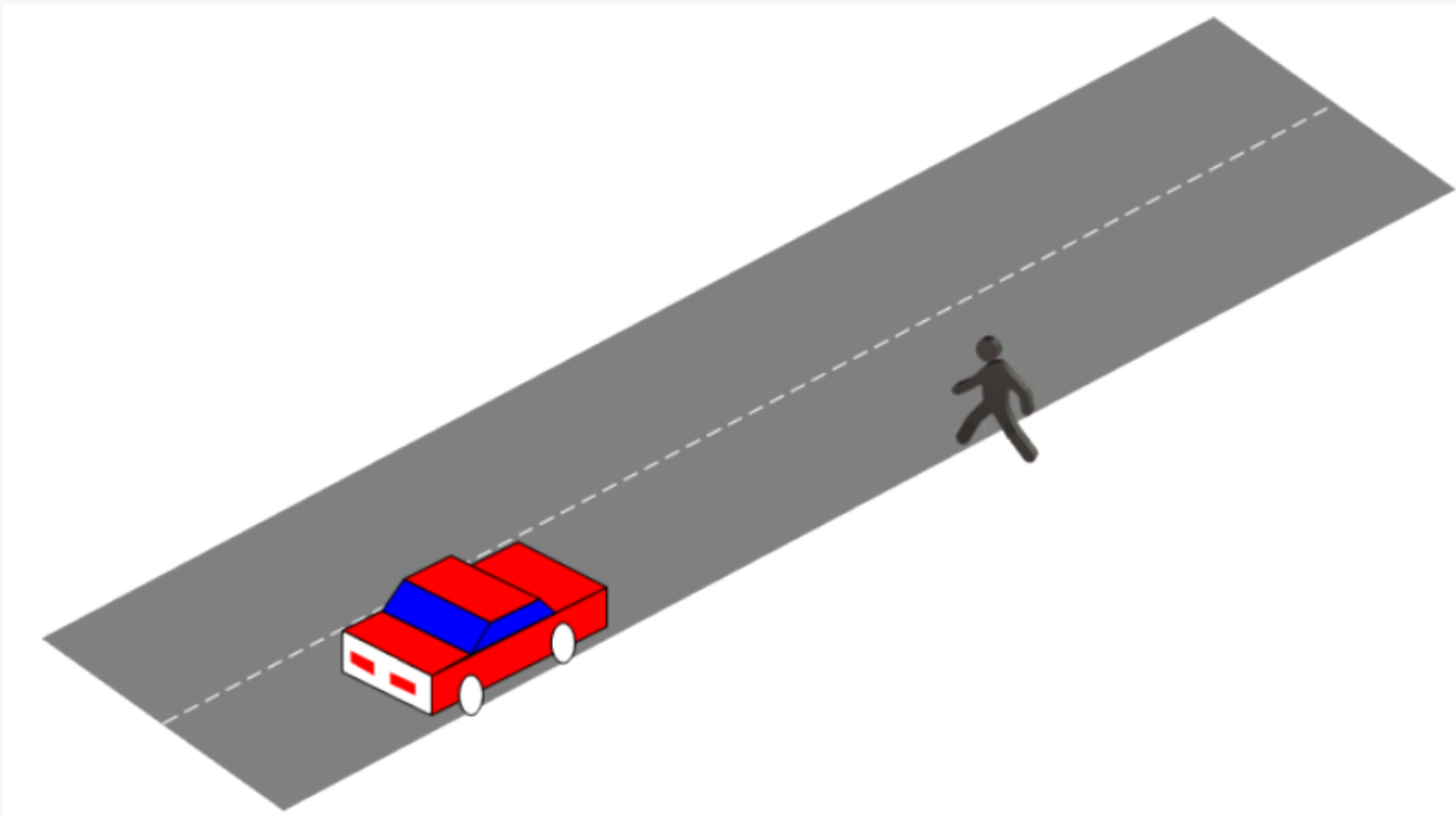
## 3) Systems based on intelligent road infrastructures

Project combining means of perception and communication: **WATCH-OVER**

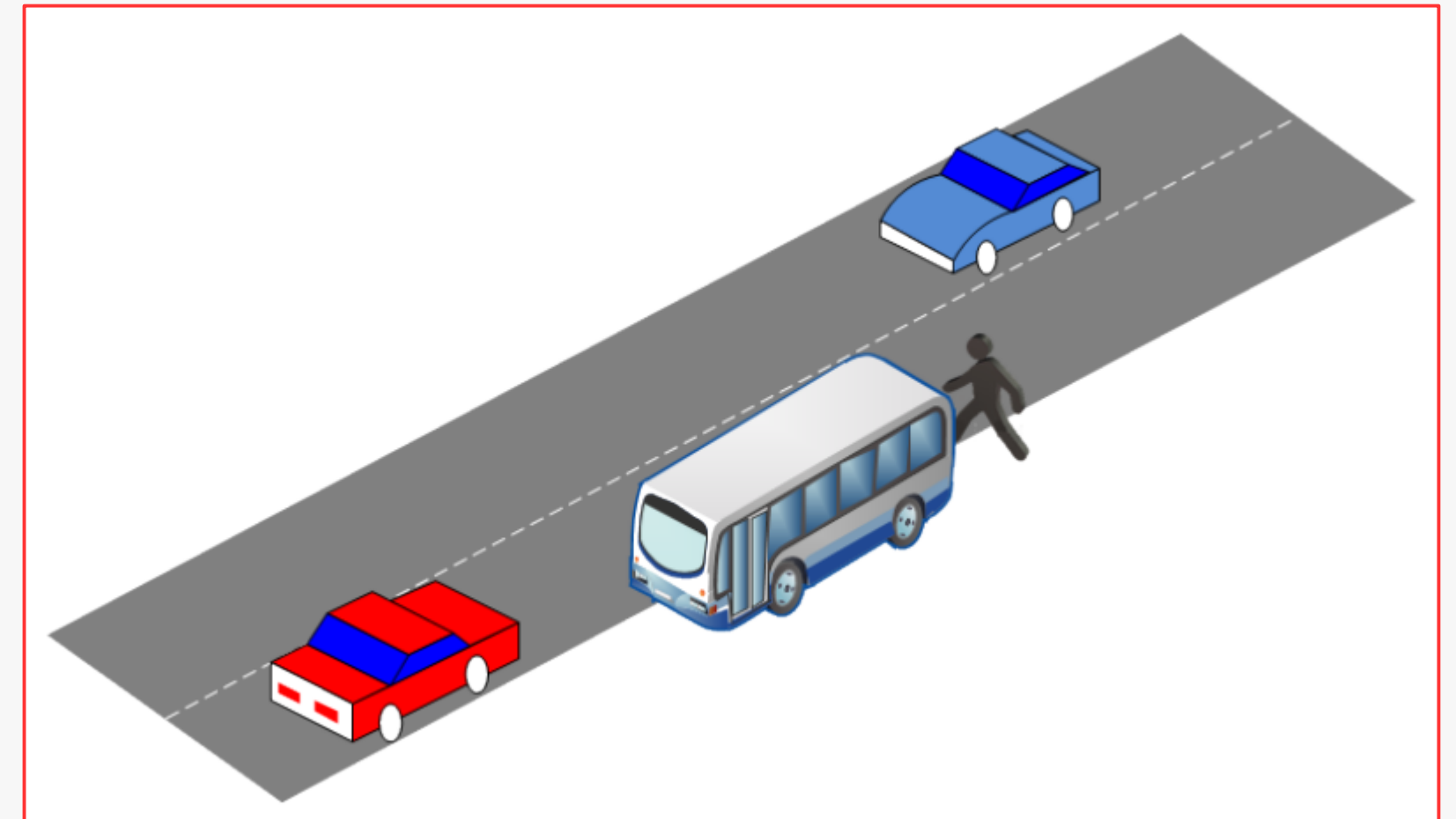
**V**ehicle-to-**V**ulnerable ro**A**d user coopera**T**ive communication and sensing te**C**hnologies to impr**O**ve transpo**R**t safety

# Problematic

*Perception problem*



*Pedestrian crossing street in front of vehicle*

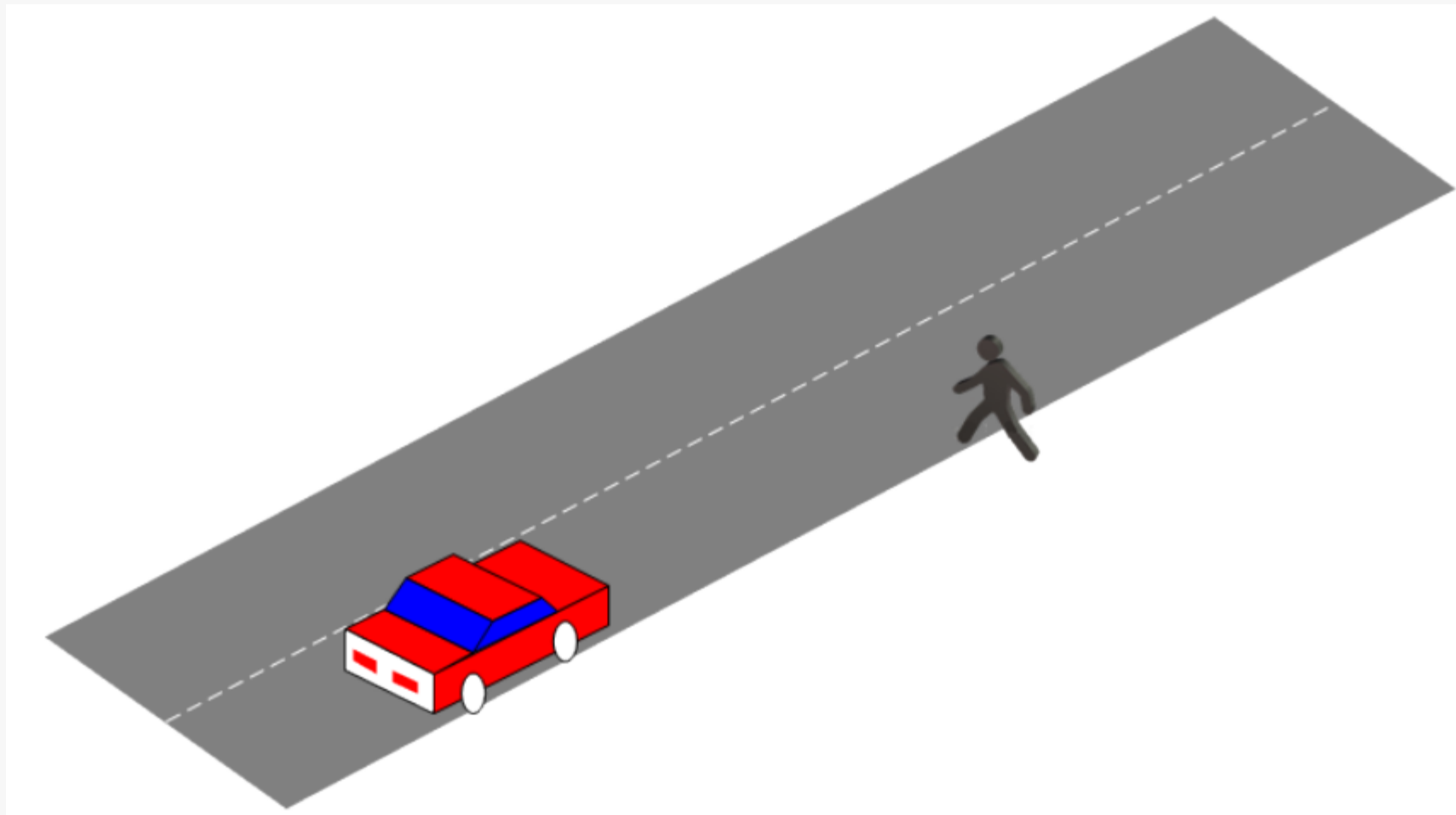


*Pedestrian masked by an obstacle*

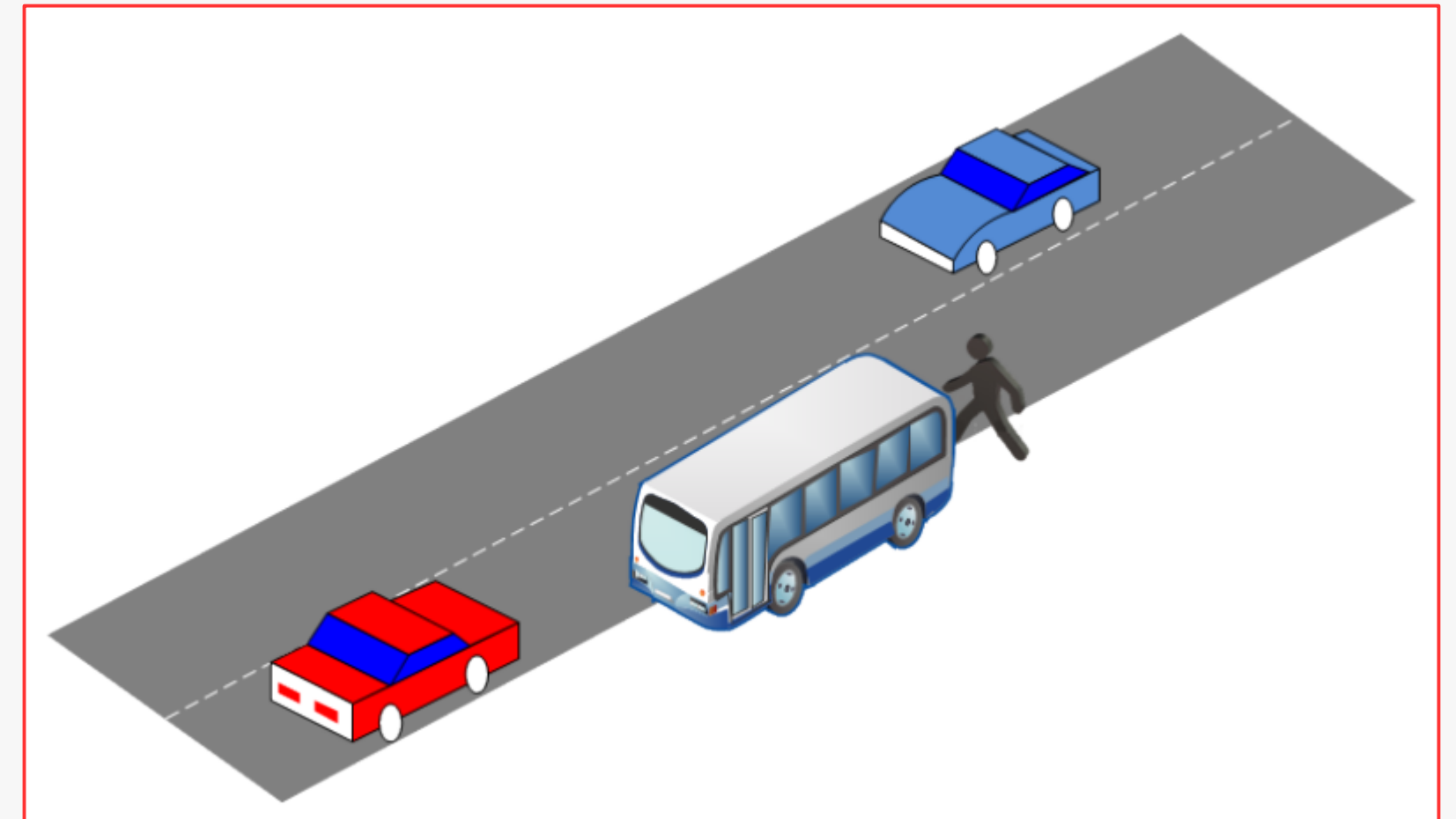
*Problem: Lack of means of **perception** and **communication** for drivers and pedestrians*

# Problematic

*Perception problem*



*Pedestrian crossing street in front of vehicle*

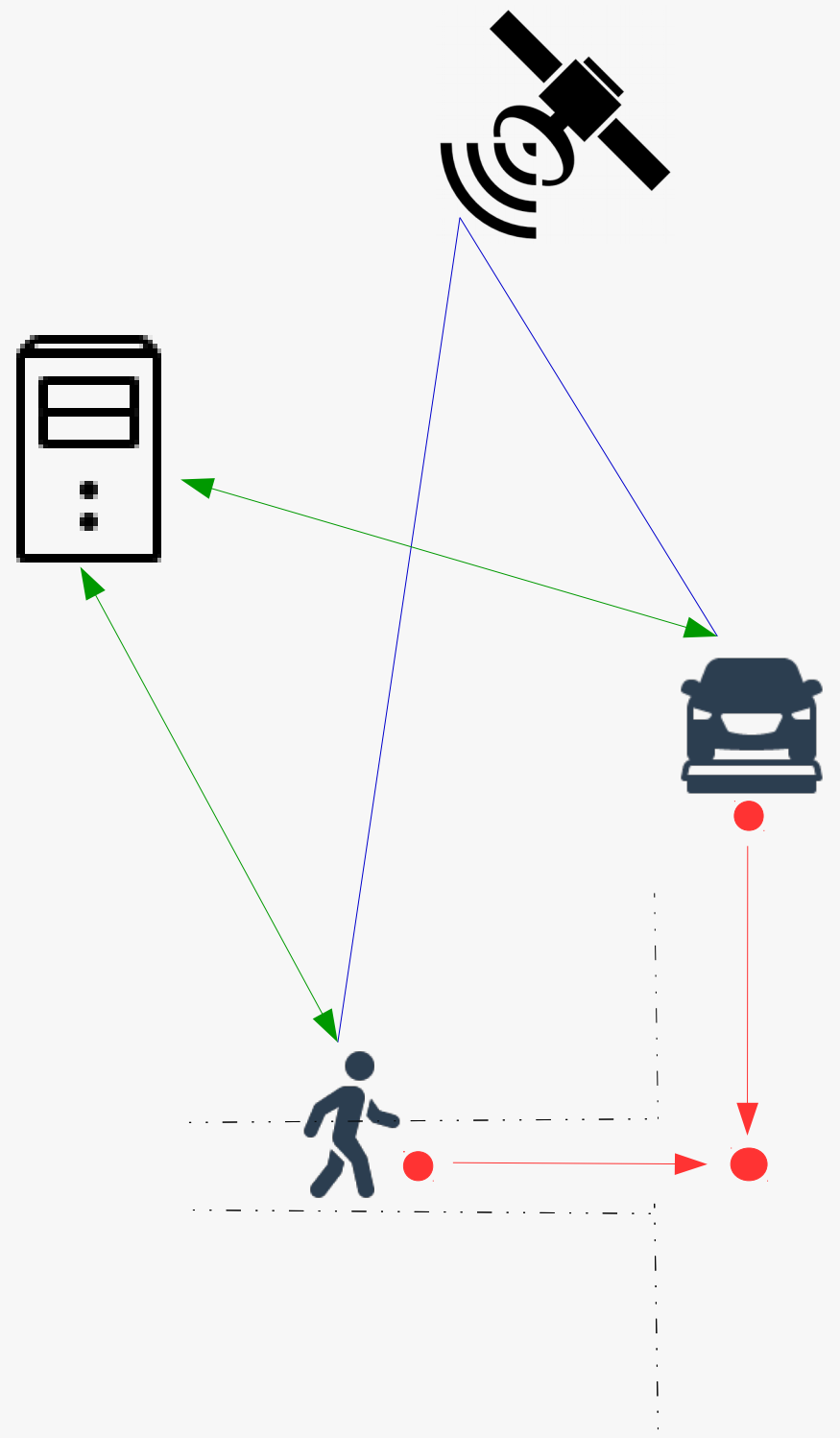


*Pedestrian masked by an obstacle*

*Problem: Lack of means of **perception** and **communication** for drivers and pedestrians*  
*Solution: Use Smartphone with GPS localization for **perception** and **communication***

# Challenges

*Vulnerable road users alert system*



*An efficient collision prediction algorithm*

*Low latency communication*

*High GPS accuracy*

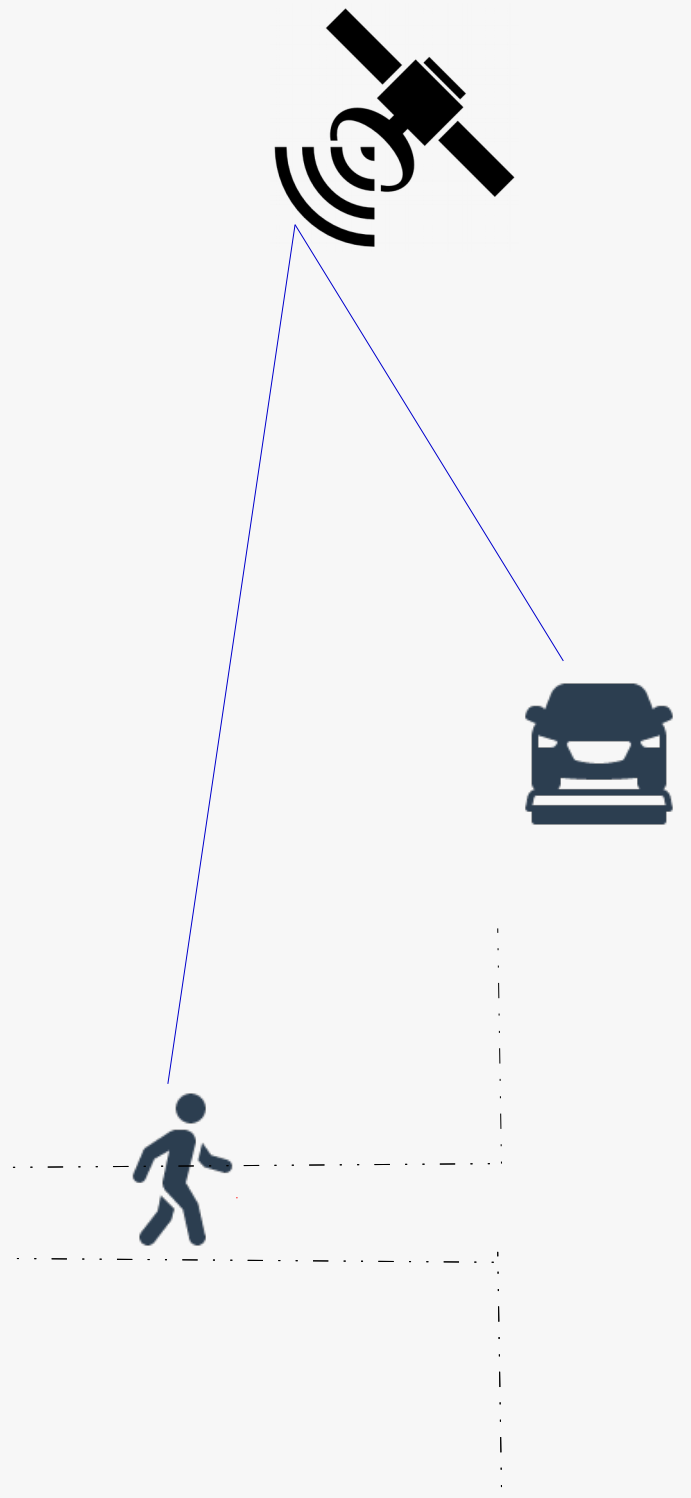
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02

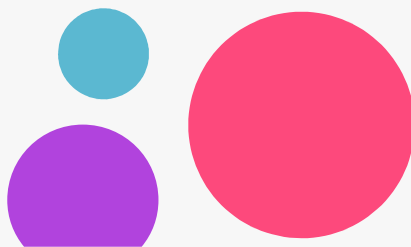
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# Challenges

*Vulnerable road users alert system*



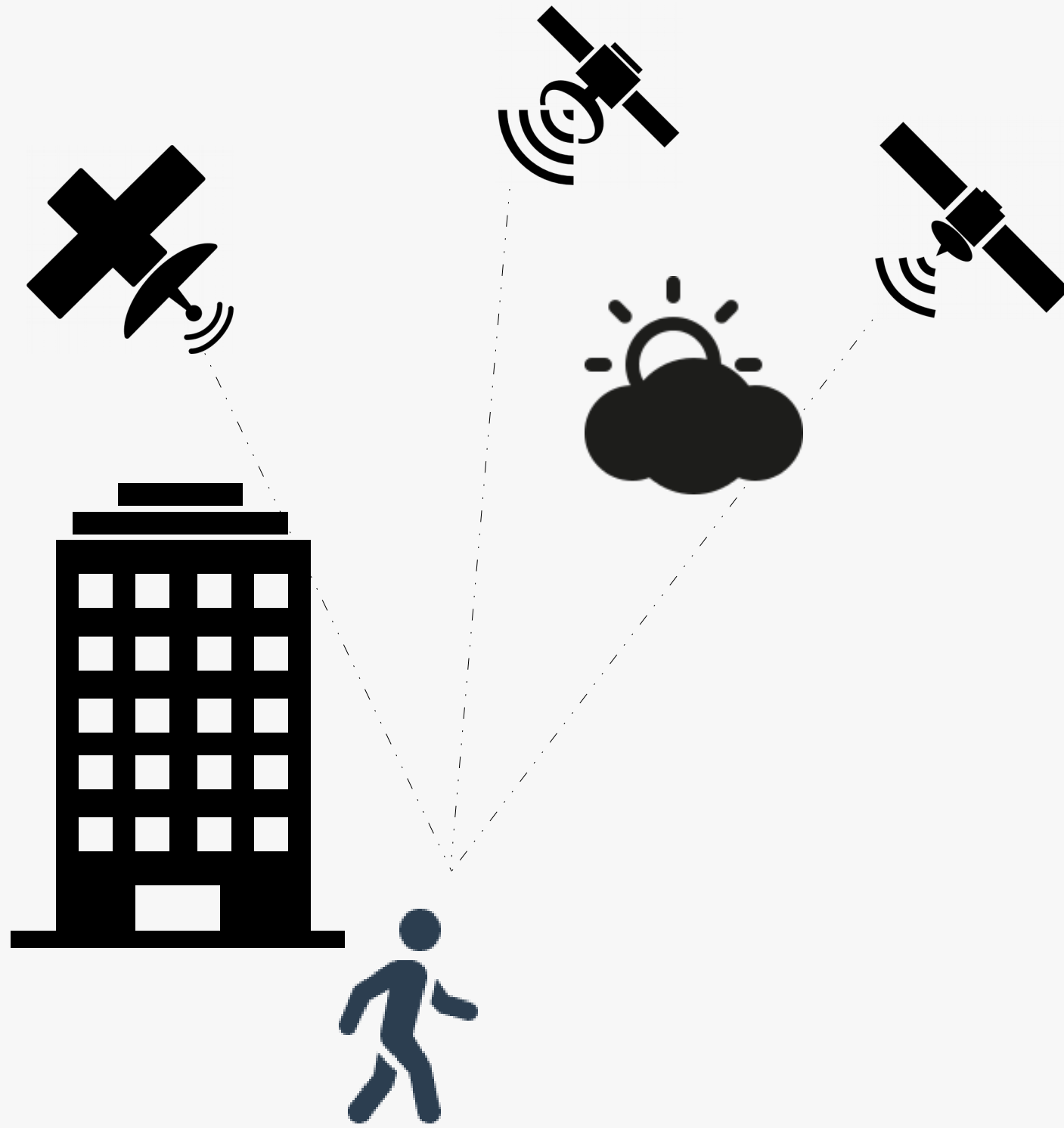
- High GPS accuracy*
- Low latency communication*
- An efficient collision prediction algorithm*





# GPS accuracy

*Area and weather conditions*



*GPS accuracy depends on:*

- *Signal strength*
- *Weather conditions*
- *Building obstacle*
- *Noise and interference*

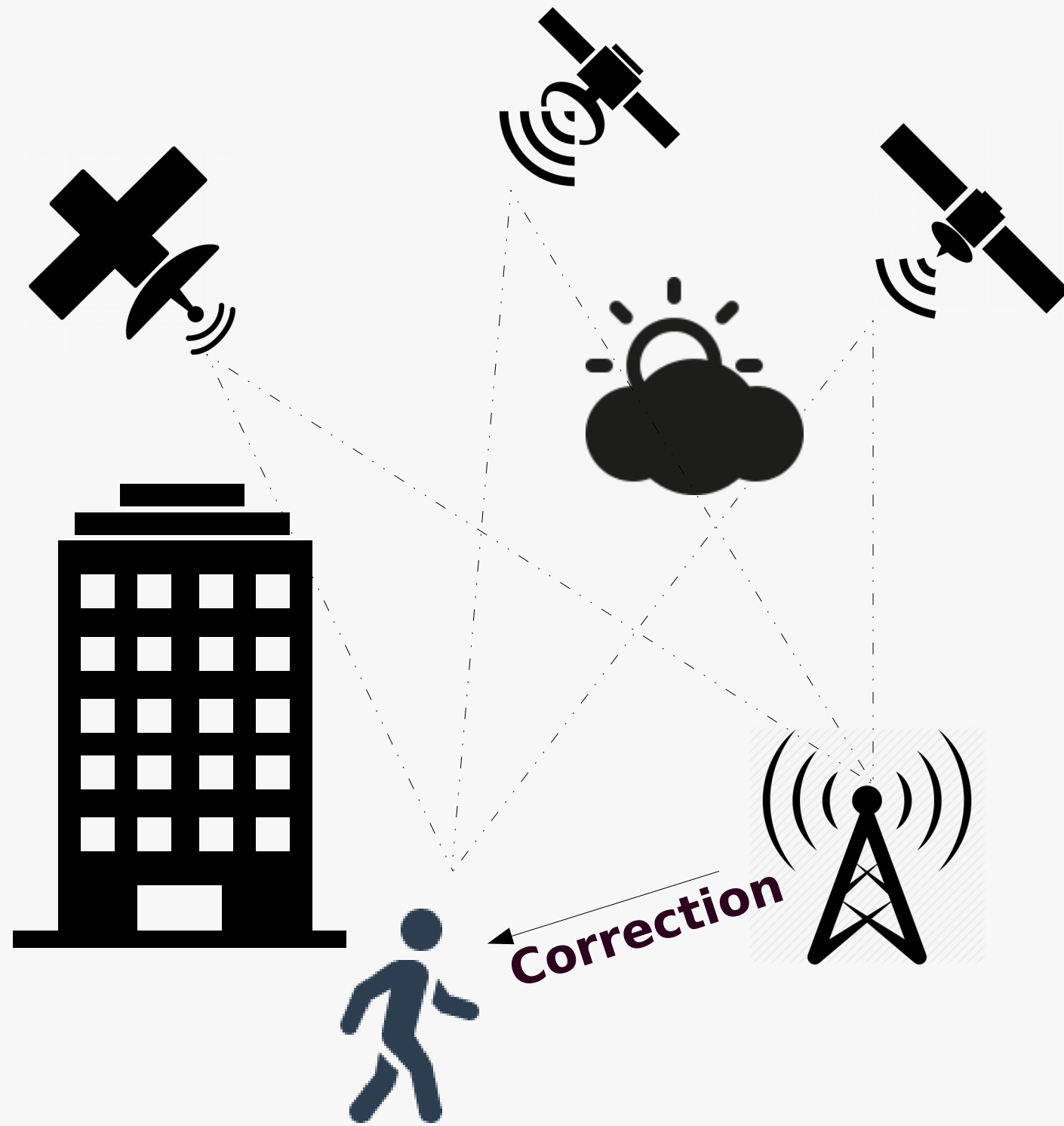
*How can we increase GPS accuracy ?*

- *Hardware-based approach:*
  - *Eliminate noise and interference (signal processing)*
  - *Differential GPS (Base station approach)*
- *Software-based approach:*
  - *Use map information to correct the location*

Map matching algorithm

# Hardware-based approach

*Differential GPS*



*GPS accuracy depends on:*

- *Signal strength*
- *Weather condition*
- *Building obstacle*
- *Noise and interference*

*How can we increase GPS accuracy ?*

- *Hardware-based approach:*
  - *Eliminate noise and interference (signal processing)*
  - *Differential GPS (Base station approach)*
- *Software-based approach:*
  - *Use map information to correct the location*

# Software-based approach

*Map-matching approach*



*GPS accuracy depends on:*

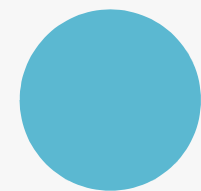
- *Signal strength*
- *Weather condition*
- *Building obstacle*
- *Noise and interference*

*How can we increase GPS accuracy ?*

- *Hardware-based approach:*
  - *Eliminate noise and interference (signal processing)*
  - *Differential GPS (Base station approach)*
- *Software-based approach:*
  - *Use map matching to correct GPS location*

Map matching algorithm

# Idea



## Increase horizontal accuracy

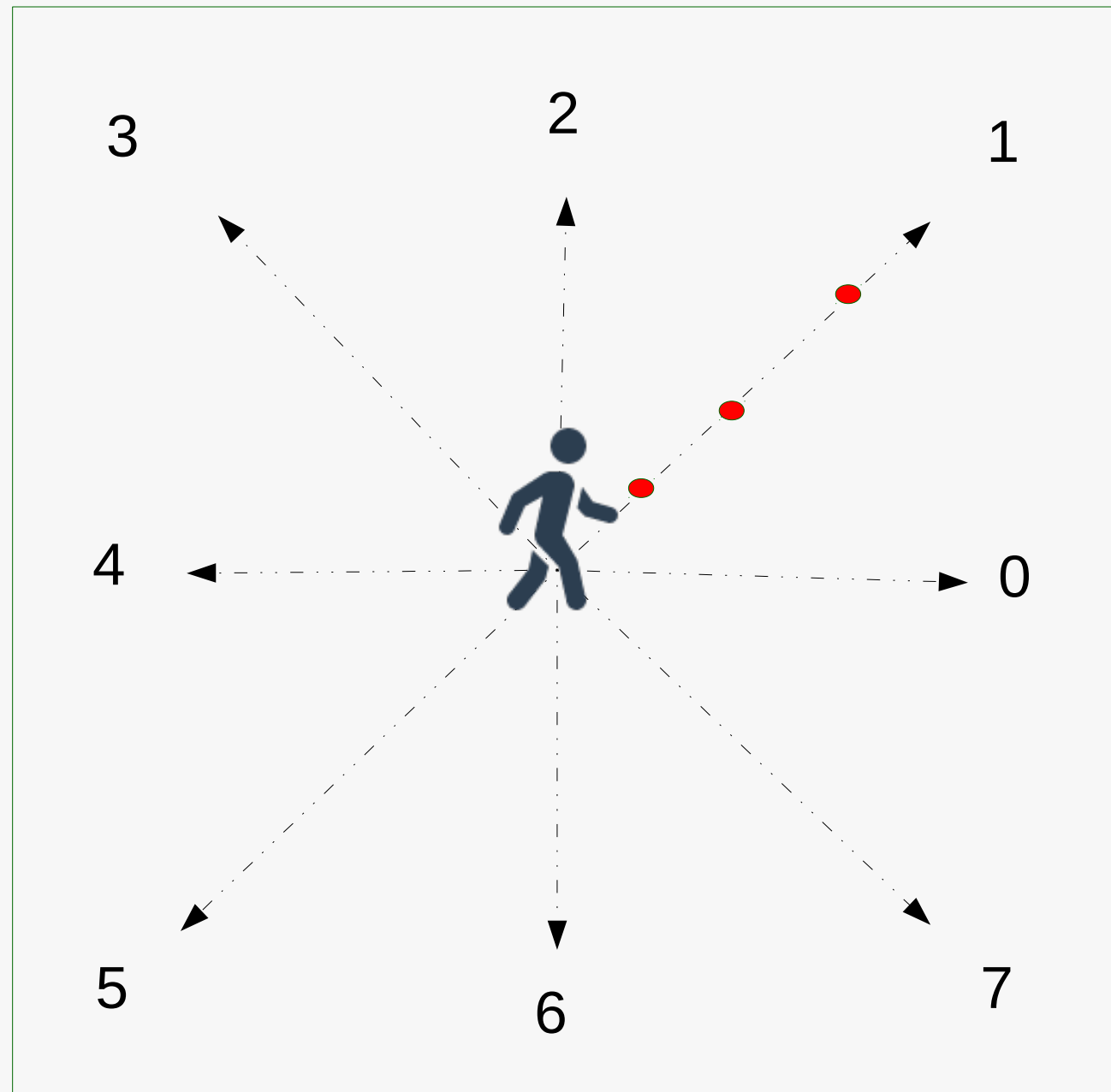
Pedestrians often take horizontal trajectory

Map matching algorithm



# Horizontal accuracy evaluation test

*Experimental setup*



D0	D1	D2	D3	D4	D5	D6	D7
0°	45°	90°	135°	180°	225°	270°	315°

d0	d1	d2	d3	d4	d5	d6	d7	d8
1m	3m	6m	9m	12m	15m	18m	21m	25m

**Table 1:** Directions (D) and distances (d) of measurements

4 scenarios

- 1) *Rural area* in a *sunny day*.
- 2) *Rural area* in a *cloudy day*
- 3) *Urban area* in a *sunny day*
- 4) *Urban area* in a *cloudy day*



# Urban area

Horizontal accuracy evaluation

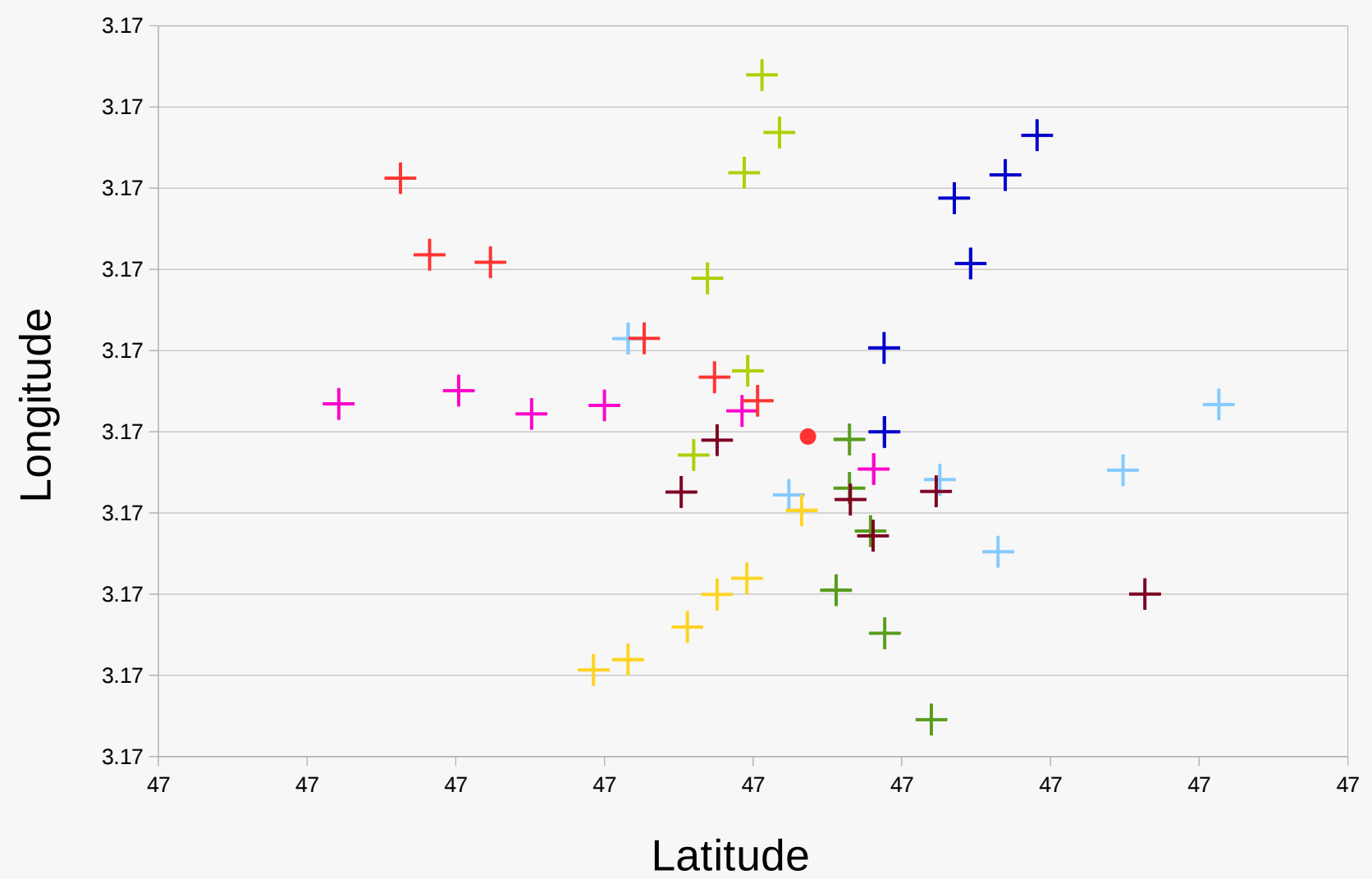
 Sunny day



 Cloudy day

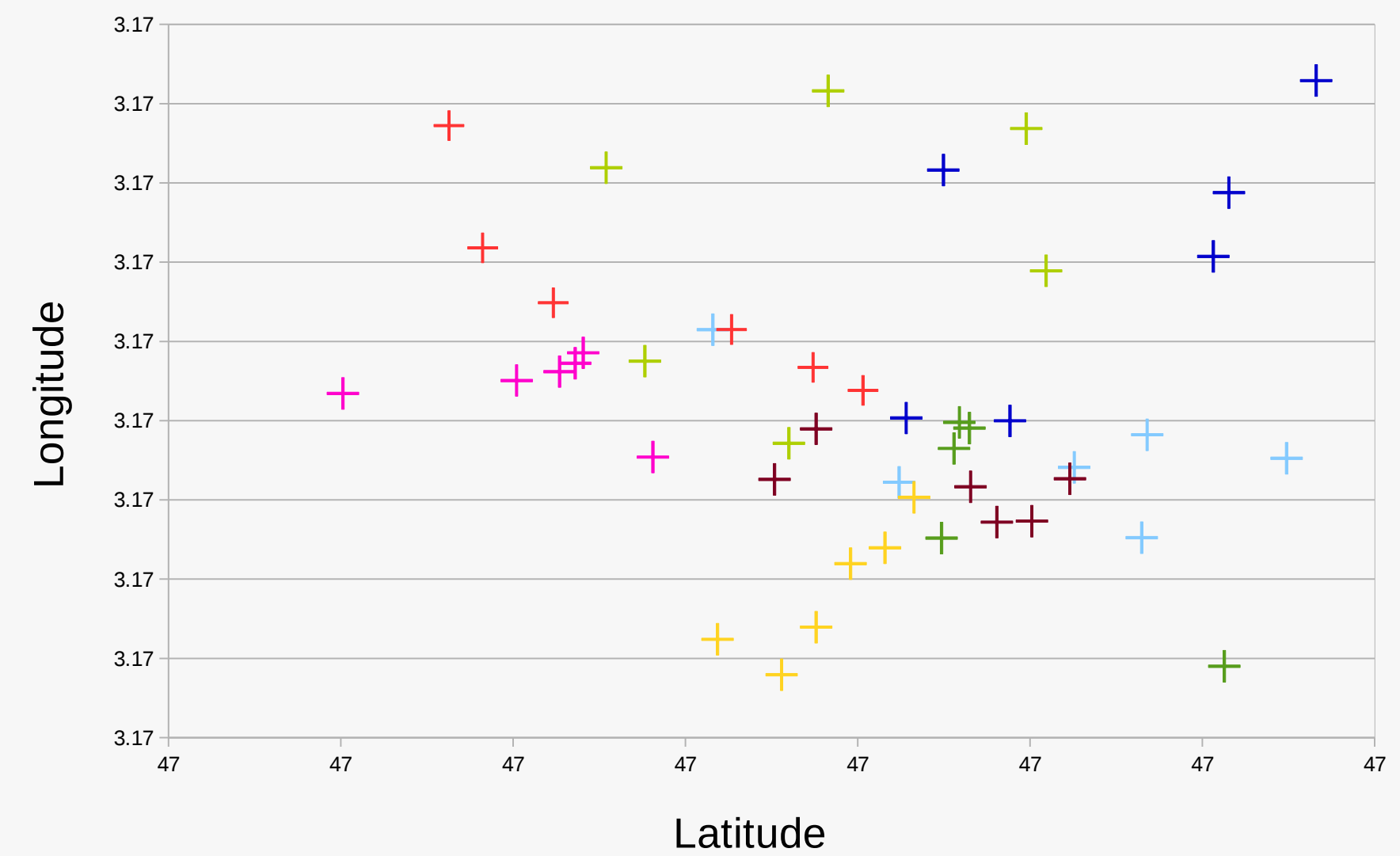


Smartphone Location



GPS error: 2 to 7 meters

Smartphone Location



GPS error: 3 to 9 meters

Map matching algorithm



# Rural area

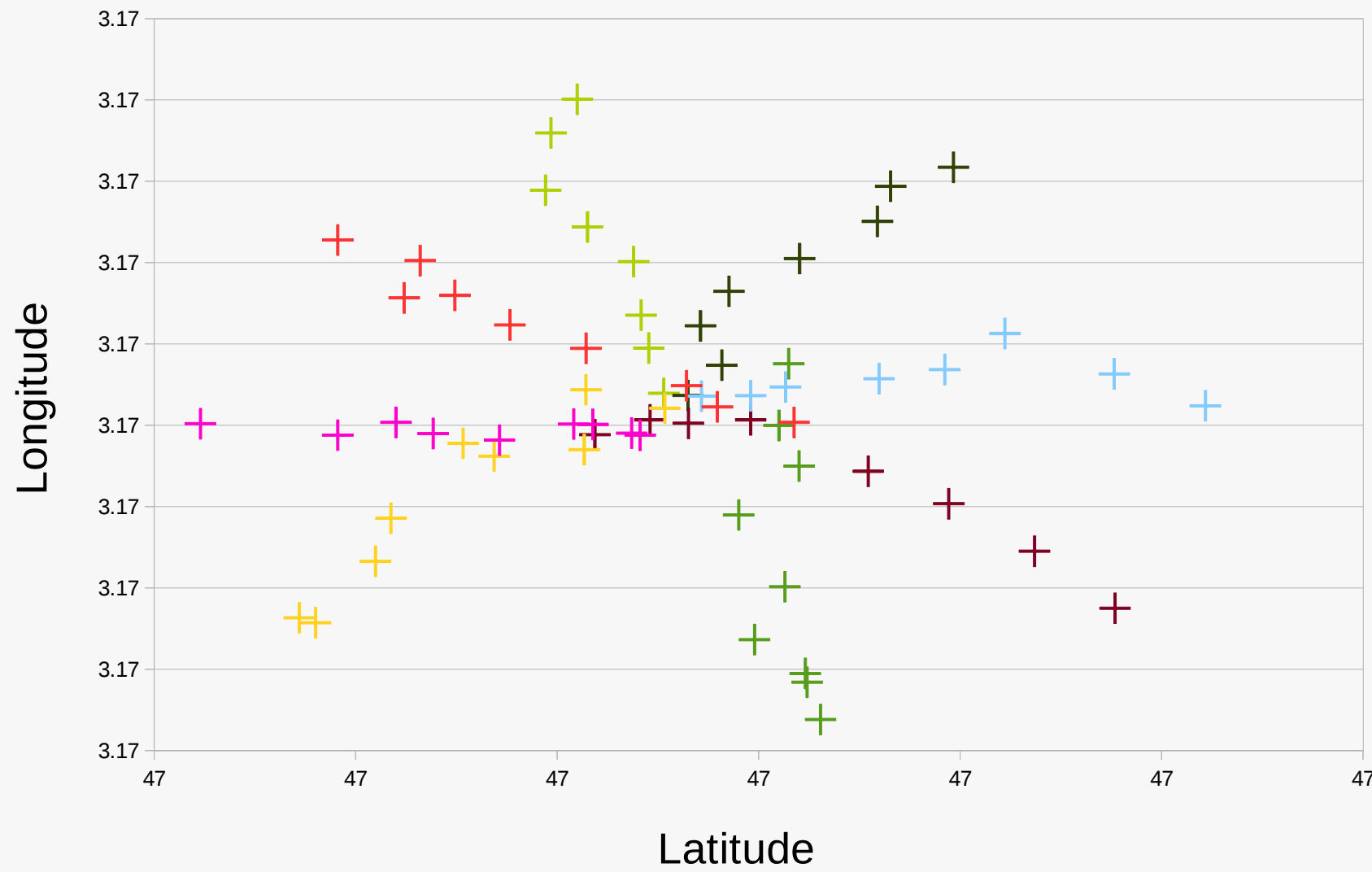
Horizontal accuracy evaluation



Sunny day



Smartphone Location



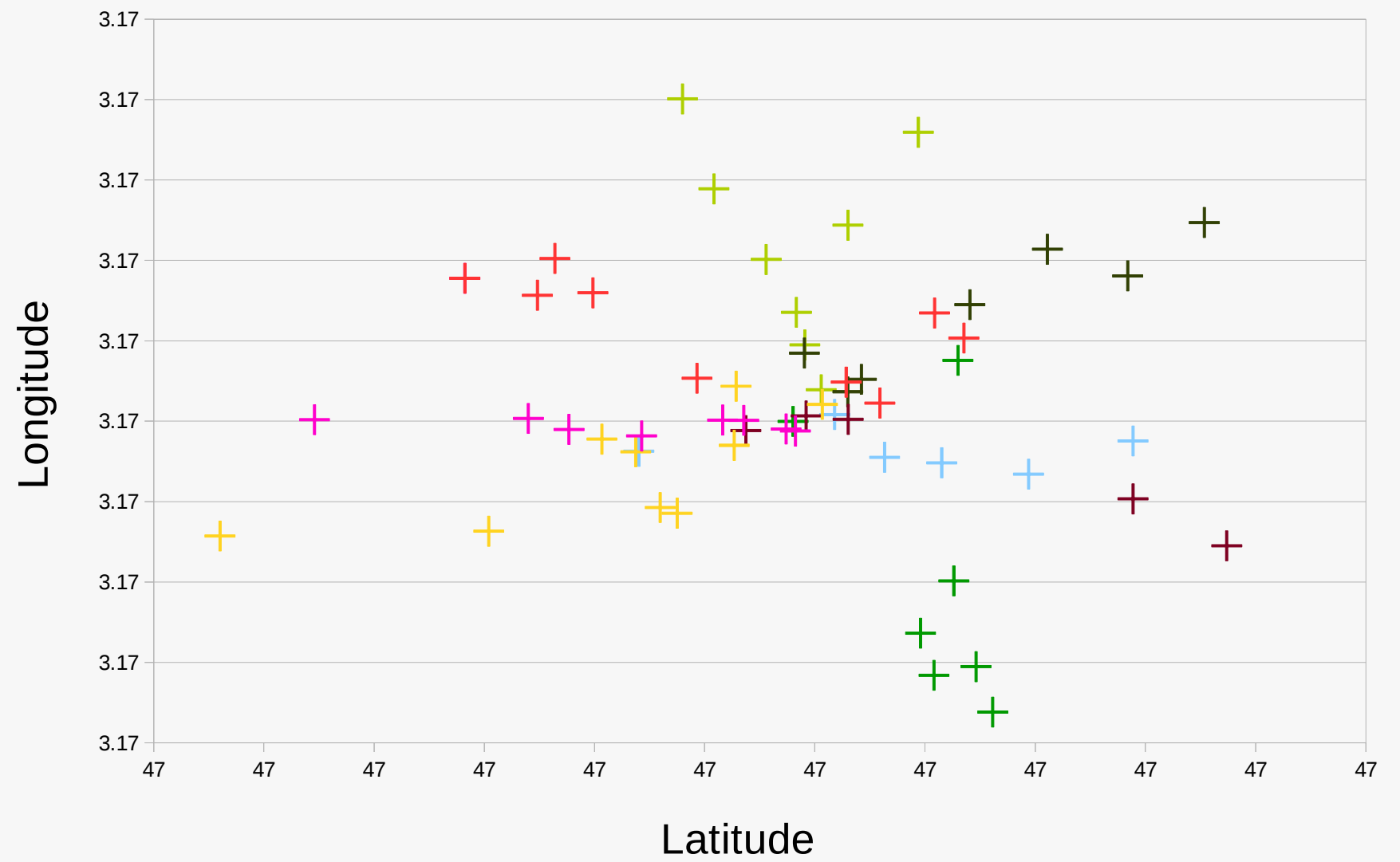
GPS error: 2 to 3 meters



Cloudy day

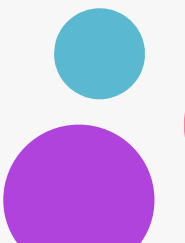


Smartphone Location



GPS error: 2 to 6 meters

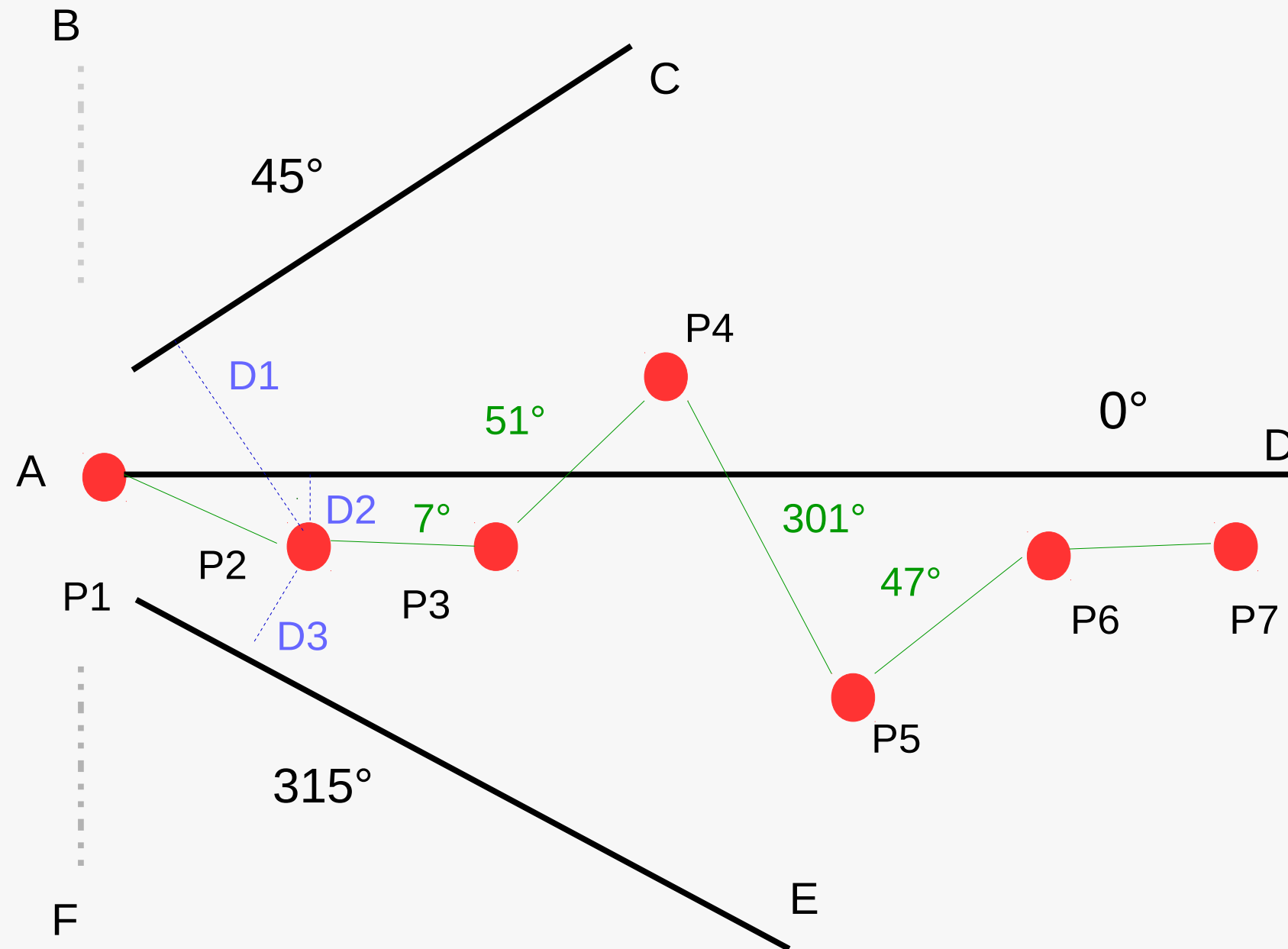
Map matching algorithm



# Map matching algorithm (Step1)

*Chain-Code-based Map Matching Technique*

$$\Delta = |(\text{Pedestrian direction})^\circ - (\text{Segment direction})^\circ|$$

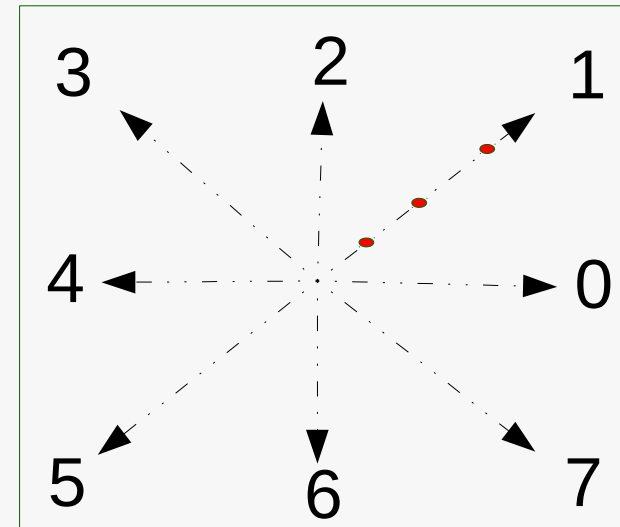


Segment	Distance	$\Delta 1$	$\Delta 2$	$\Delta 3$	$\Delta 4$
AC	D1	38°	6°	256°	2°
AD	D2	7°	51°	301°	47°
AE	D3	308°	264°	14°	268°

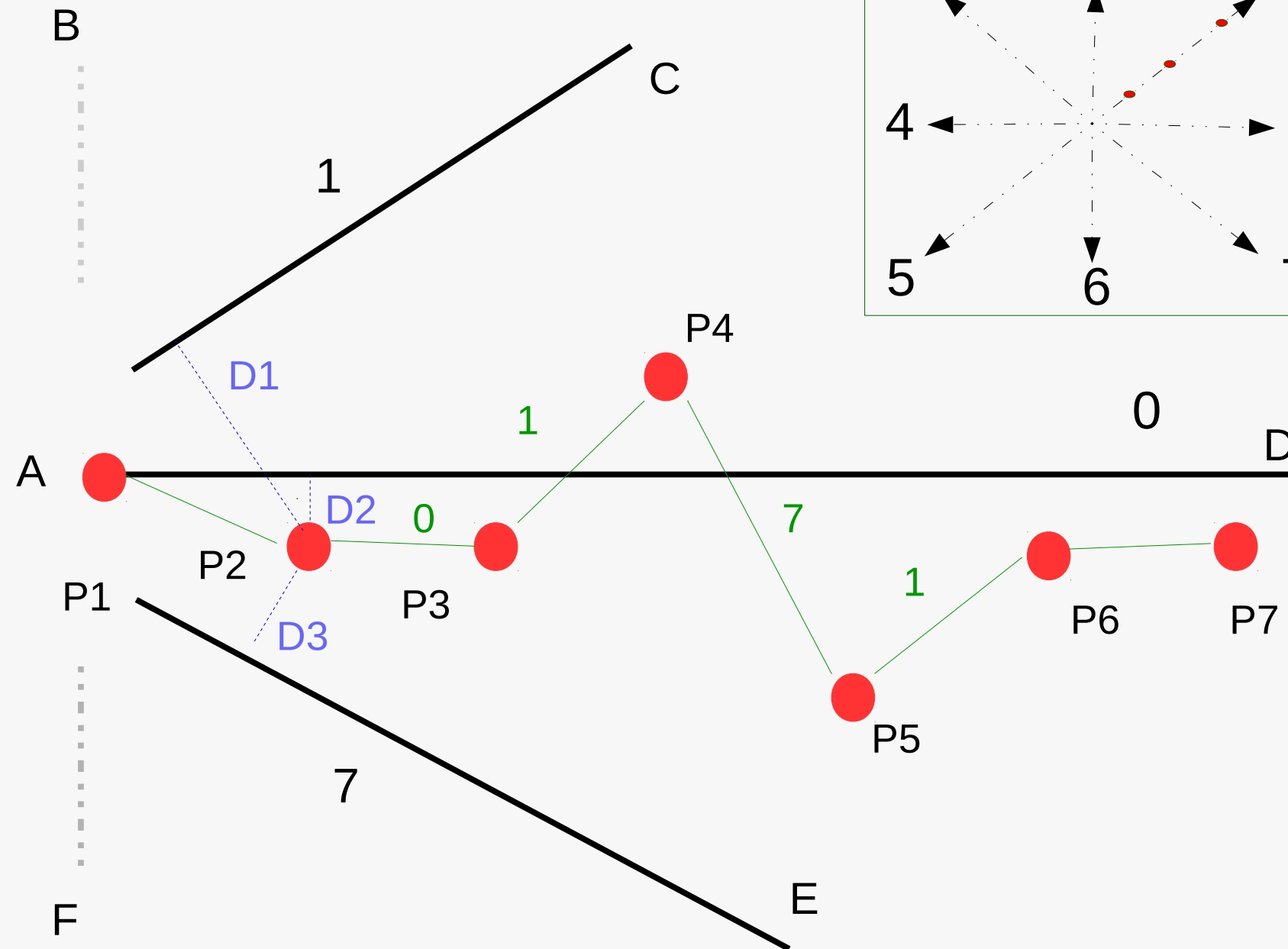


# Map matching algorithm (Step2)

Chain-Code-based Map Matching Technique



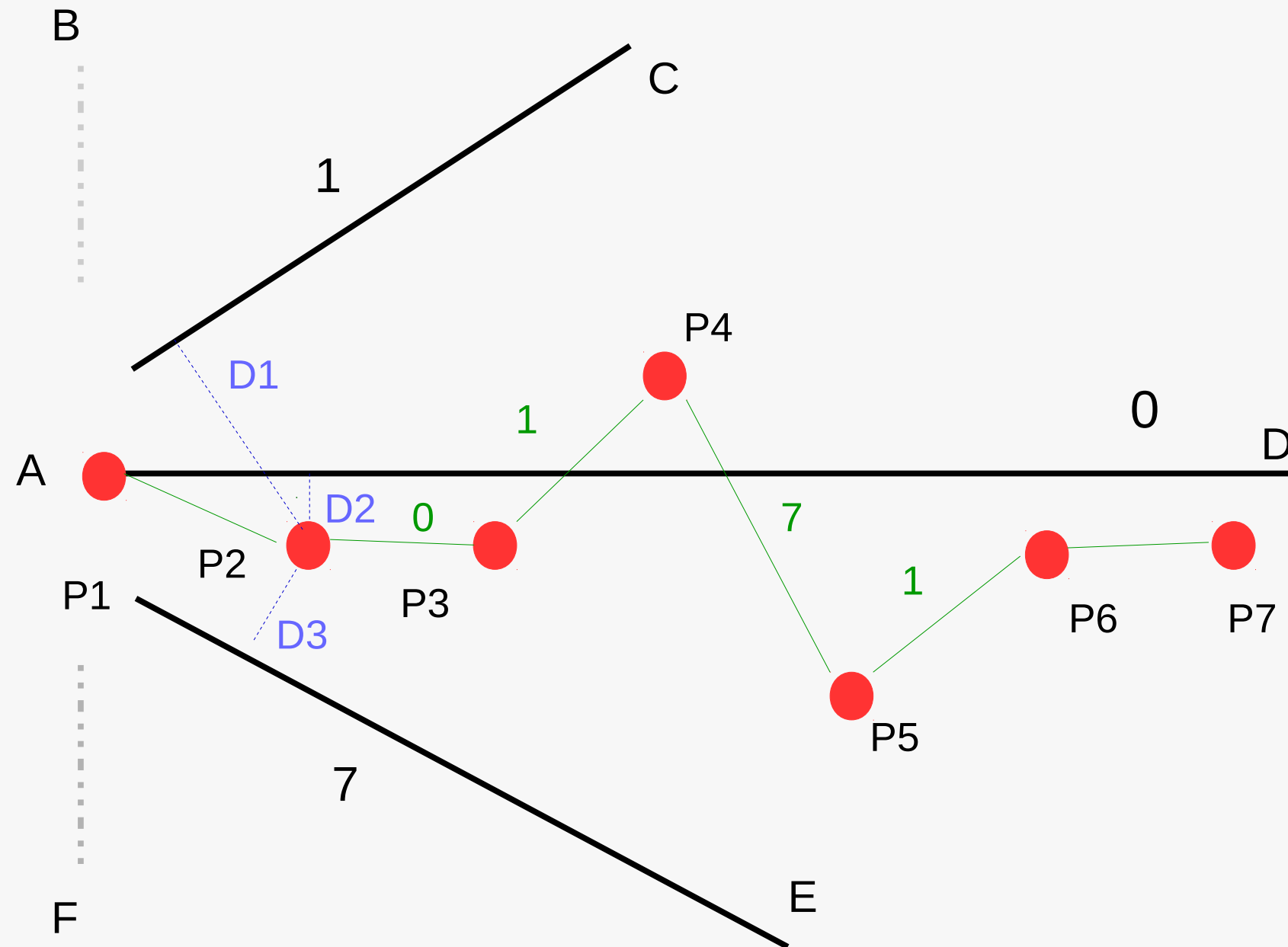
$$\Delta = |\text{Chain-Code [Pedestrian]} - \text{Chain-Code [Segment]}|$$



Segment	Distance	$\Delta 1$	$\Delta 2$	$\Delta 3$	$\Delta 4$
AC	D1	1	0	6	0
AD	D2	0	1	7	1
AE	D3	7	6	0	6

# Map matching algorithm (Step3)

*Chain-Code-based Map Matching Technique*



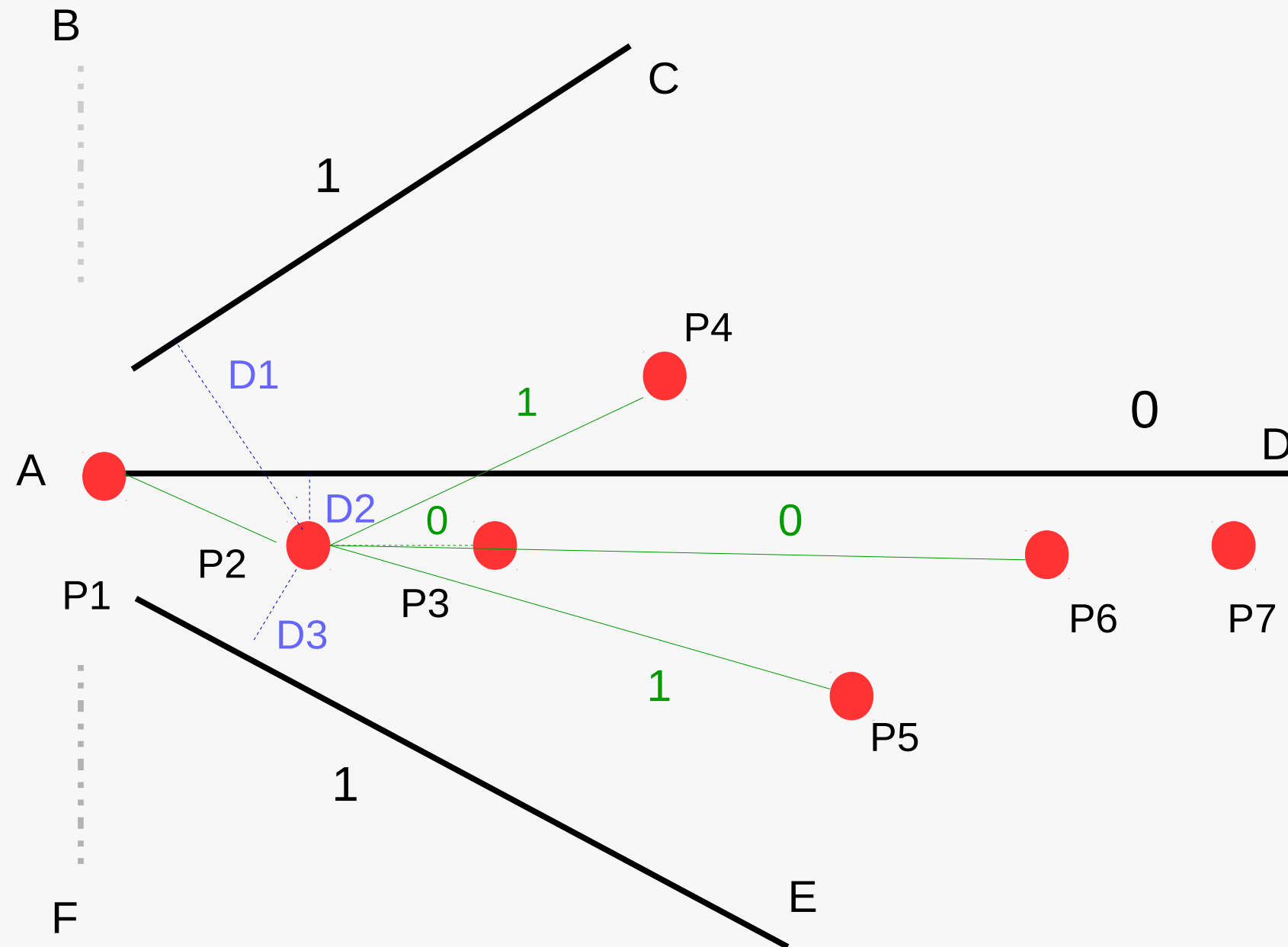
$$\Delta = |\text{Chain-Code [Pedestrian]} - \text{Chain-Code [Segment]}|$$

$$D_{cc} = \begin{cases} \Delta & \Delta < 4 \\ (|\Delta - 8|) \bmod 4 & \text{otherwise} \end{cases}$$

Segment	Distance	DCC1	DCC2	DCC3	DCC4
AC	D1	1	0	2	0
AD	D2	0	1	1	1
AE	D3	1	2	0	2

# Map matching algorithm (Step4)

*Chain-Code-based Map Matching Technique*

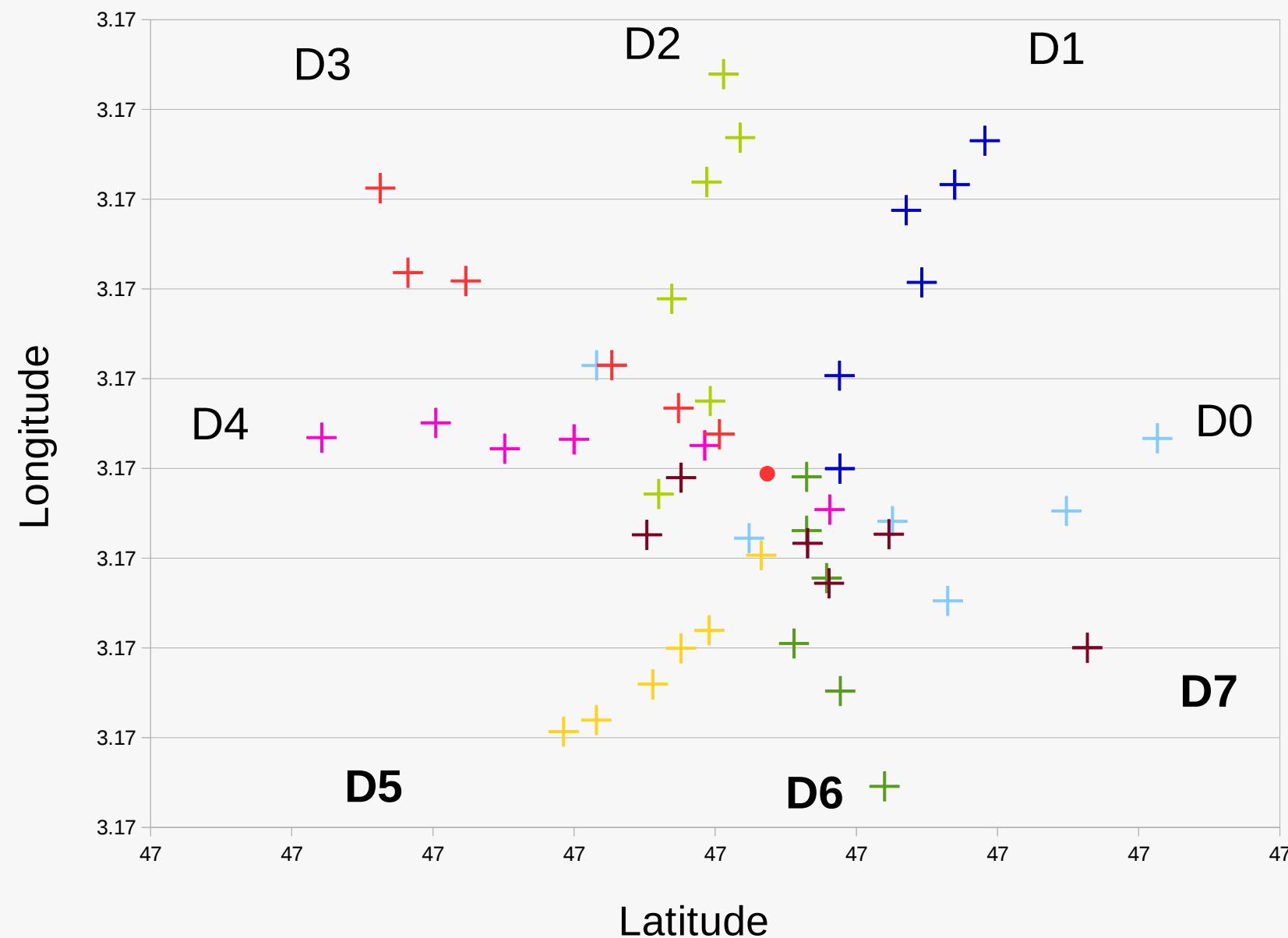


$$\Delta = |\text{Chain-Code [Pedestrian]} - \text{Chain-Code [Segment]}|$$

$$D_{cc} = \begin{cases} \Delta & \Delta < 4 \\ (|\Delta - 8|) \bmod 4 & \text{otherwise} \end{cases}$$

Segment	Distance	DCC1	DCC2	DCC3	DCC4
AC	D1	1	0	2	1
AD	D2	0	1	1	0
AE	D3	1	2	0	1

# Map matching algorithm



*2 Models:*

- *Linear model*
- *Non-linear model:*
  - *Radial basis functional neural network*

*4 Scenarios:*

- *2 different areas:*
  - *Urban and Rural area*
- *2 different weather conditions*
  - *Sunny and cloudy day*

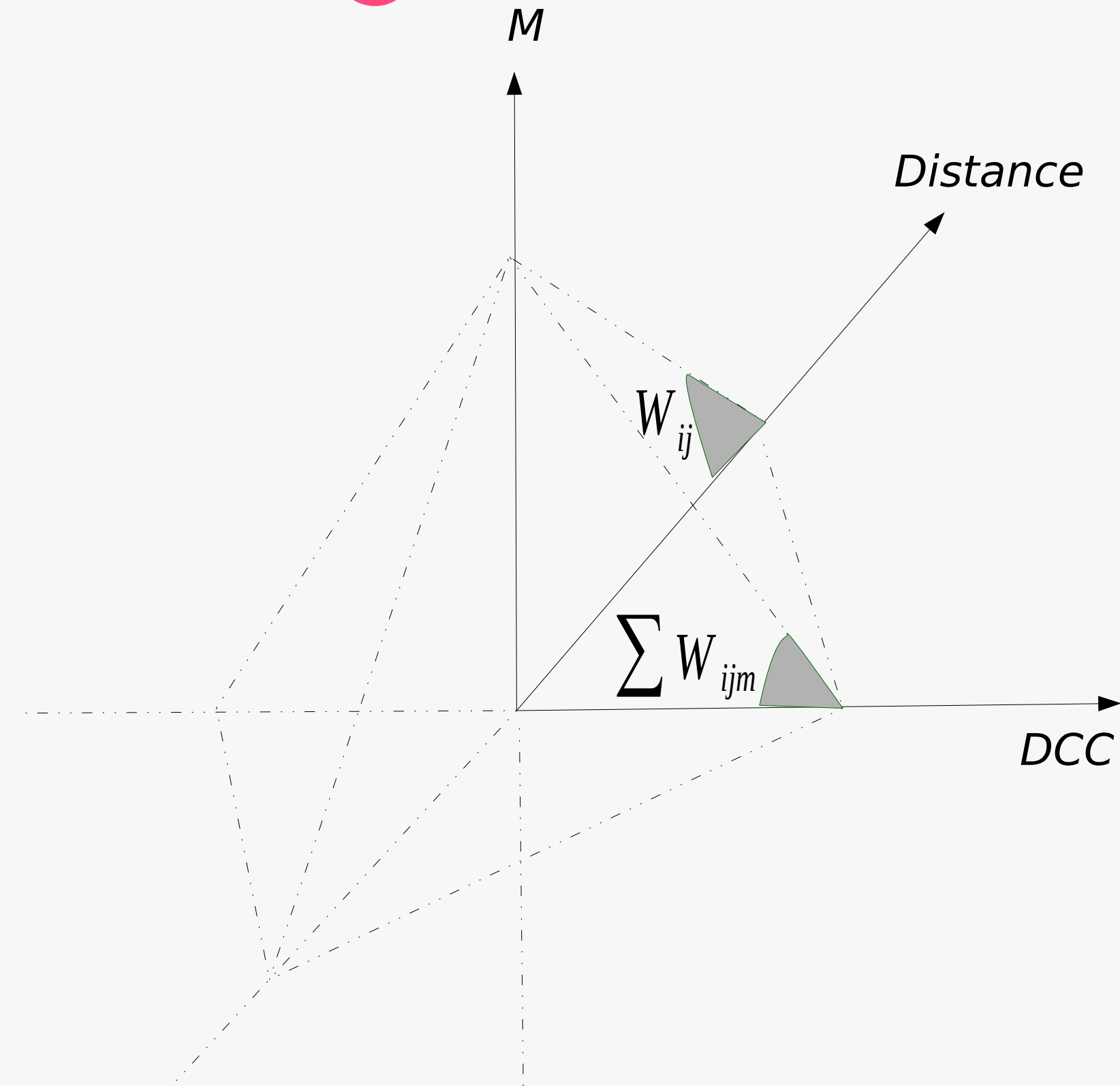
*Training data:*

- *5 directions (D0-D4)*

*Testing data:*

- *3 directions (D5-D7)*

# Linear model



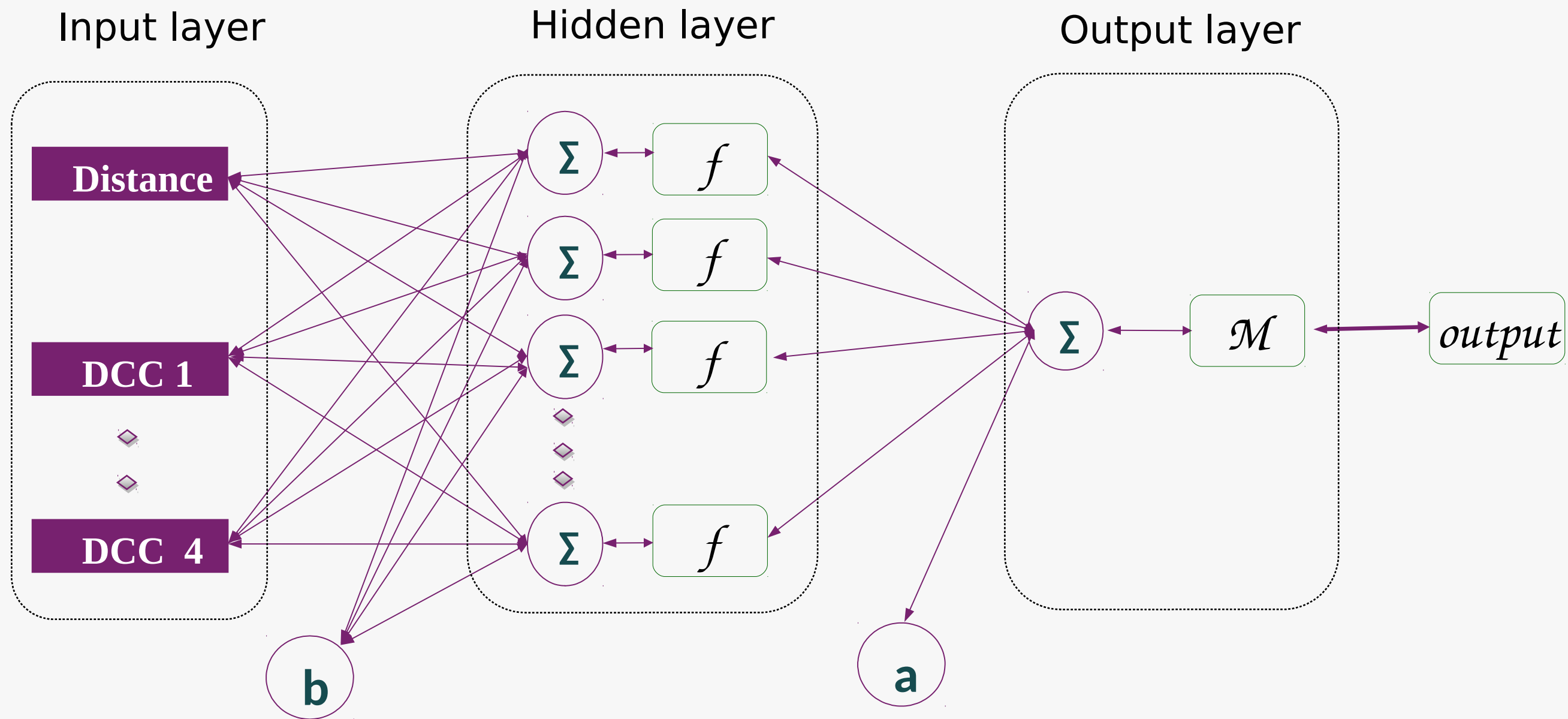
Segment	Distance	DCC1	DCC2	DCC3	DCC4
AC	D1	1	0	2	1
AD	D2	0	1	1	0
AE	D3	1	2	0	1

$$V_{ij} = W_{ij} * D_{ij} + \sum_{m=1}^4 W_{ijm} * Dcc(Step[i+m], Segment[j])$$

$$M_{ij} = 1/V_{ij}$$

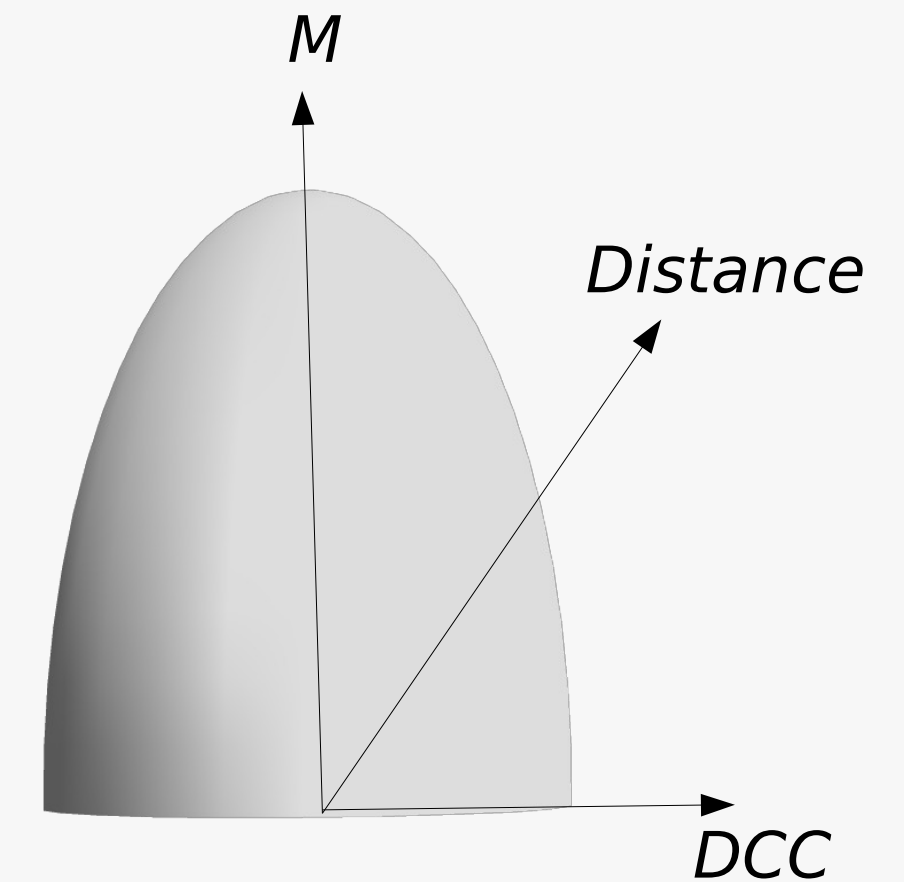
# Non-linear model


*Radial Basis Functional Neural Network*



$$f = \exp\left(\frac{-b\|x - u_k\|^2}{2\sigma_k^2}\right)$$

$$M = \sum_{k=0}^n af$$






# Results

*Discussion*

		Linear model		Non-linear model	
Scenario	Number of links	Correct link identified	Average time (ms)	Correct link identified	Average time (ms)
1	27	26	4.3	25	21.1
2	27	24	4.4	23	19.3
3	27	23	3.2	22	15.7
4	27	20	3.5	20	14.2



# Results

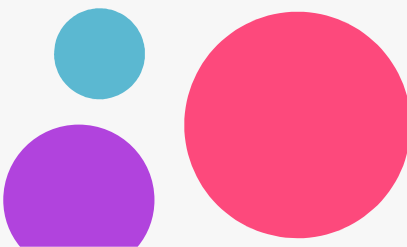
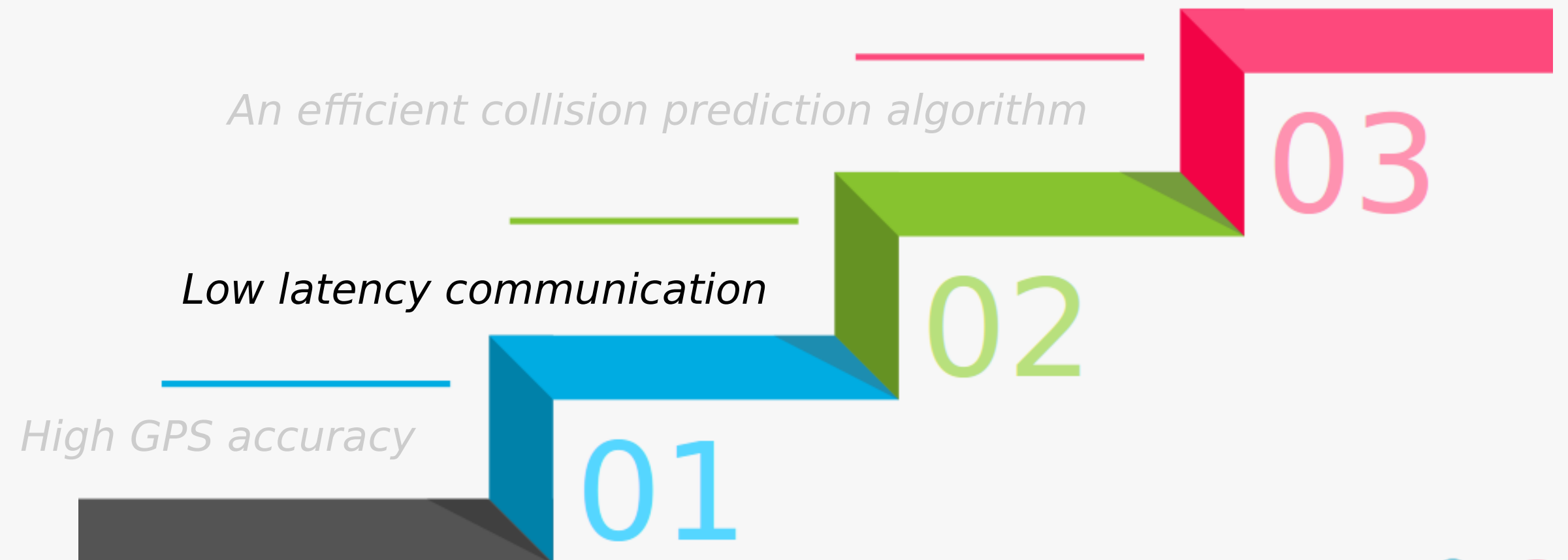
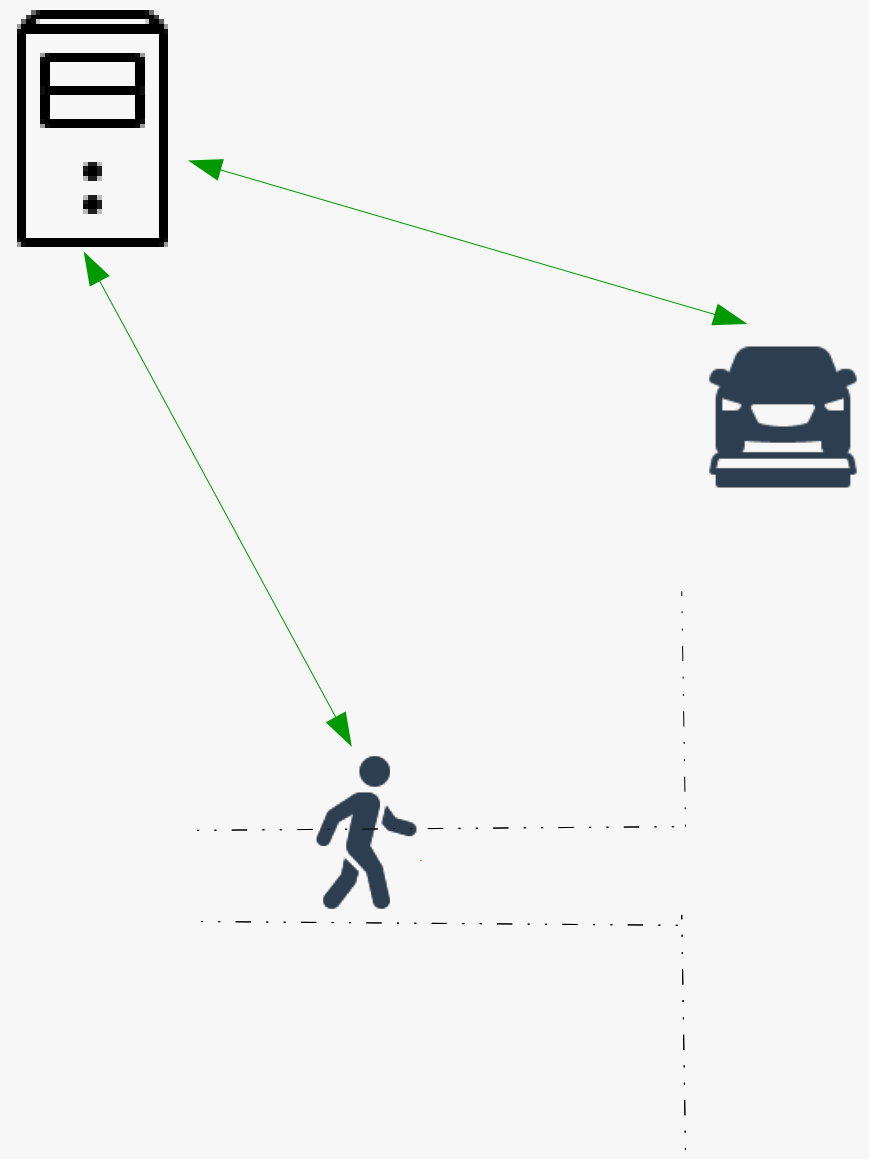
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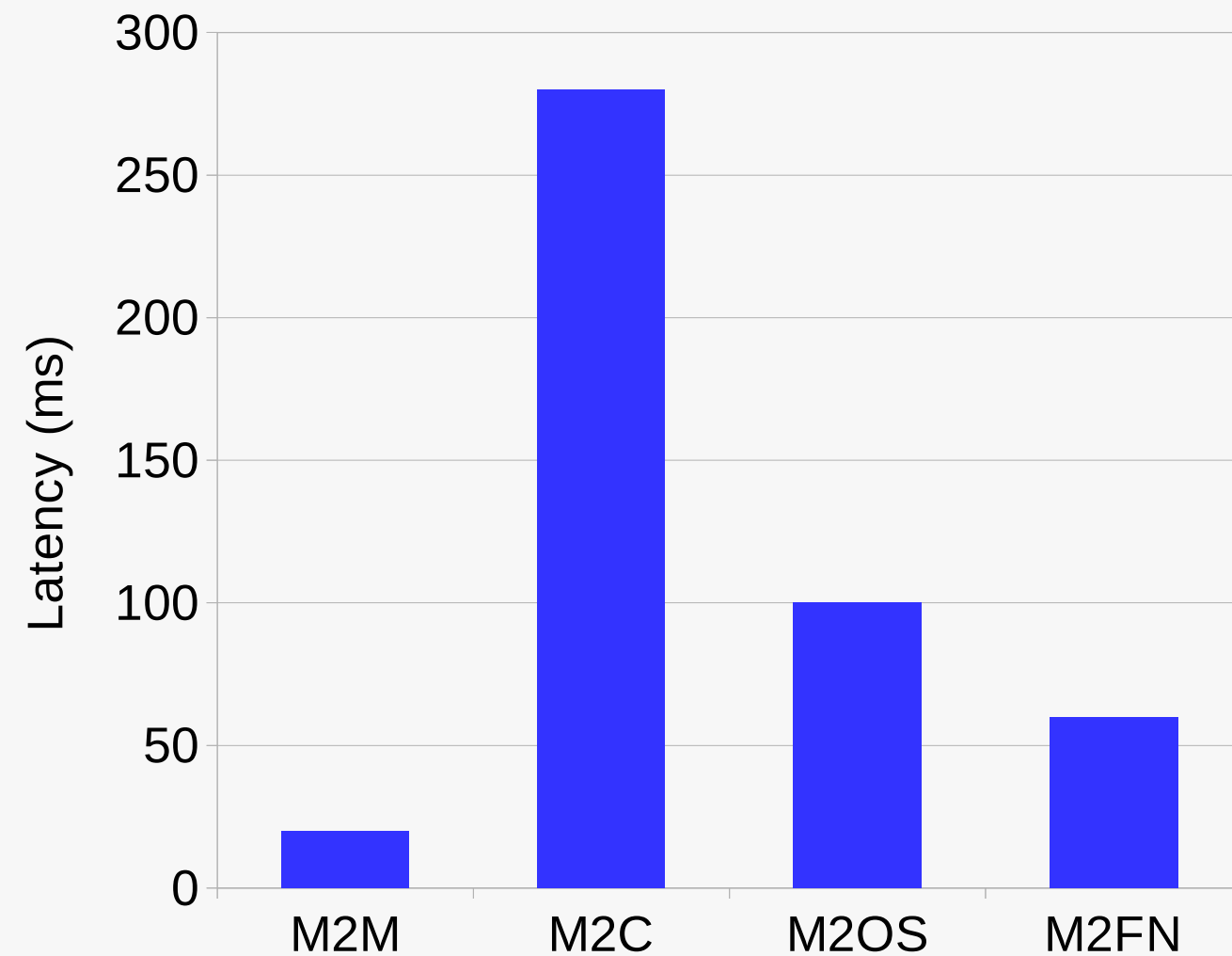
# Challenges

*Vulnerable road users alert system*



# Fog computing architecture

*Different architectures*

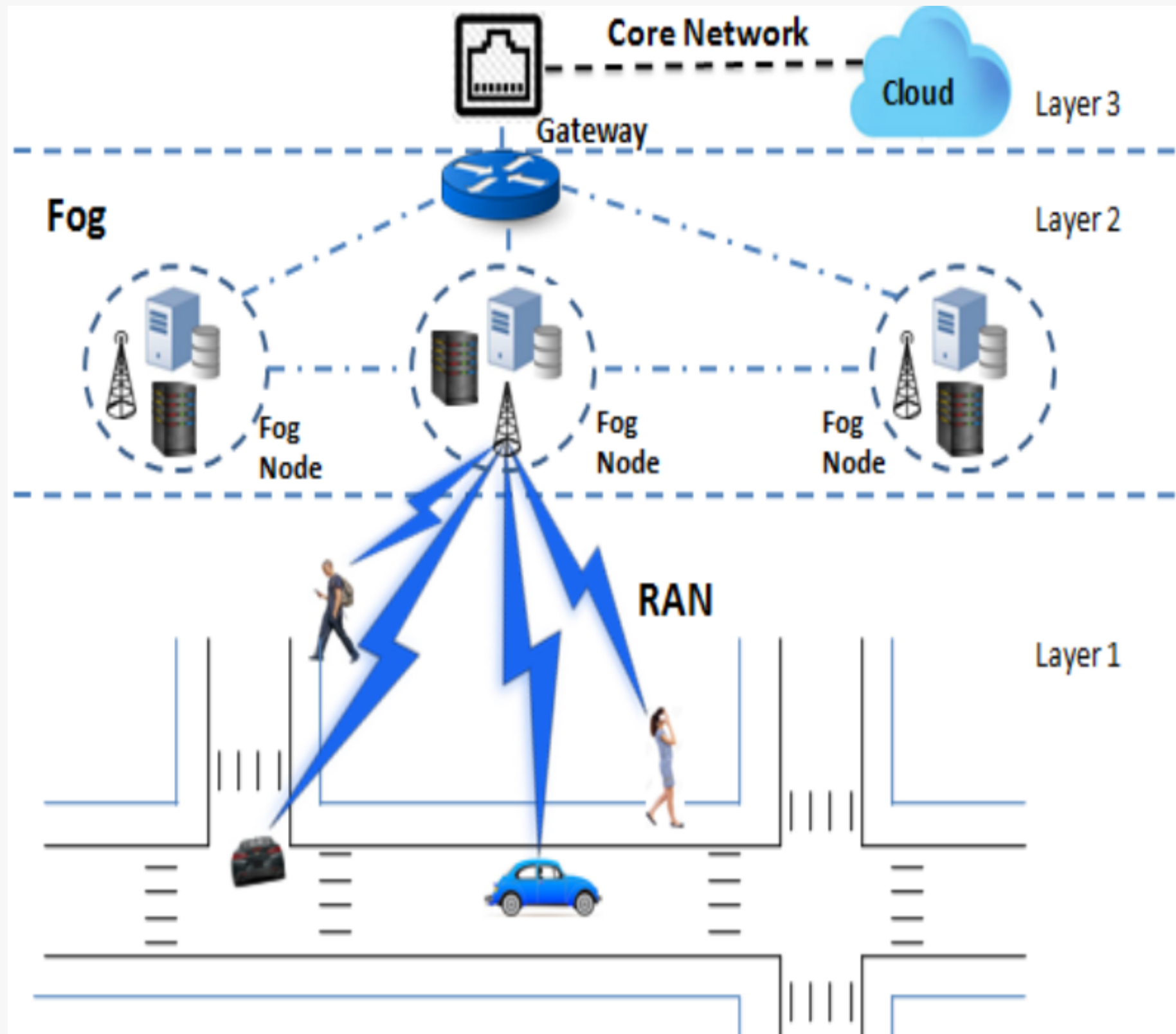


*Latency of different smartphone-based VRU safety architectures*

Architecture	M2M	M2C	M2OS	M2FN
Energy saving	-	+	+	+
Latency	+	-	+	+
Reliability	+	-	-	+
Scalability	-	+	-	+
Computational capability	-	+	+	+
Message management	-	+	+	+

# Fog computing architecture

*3 layers architecture*

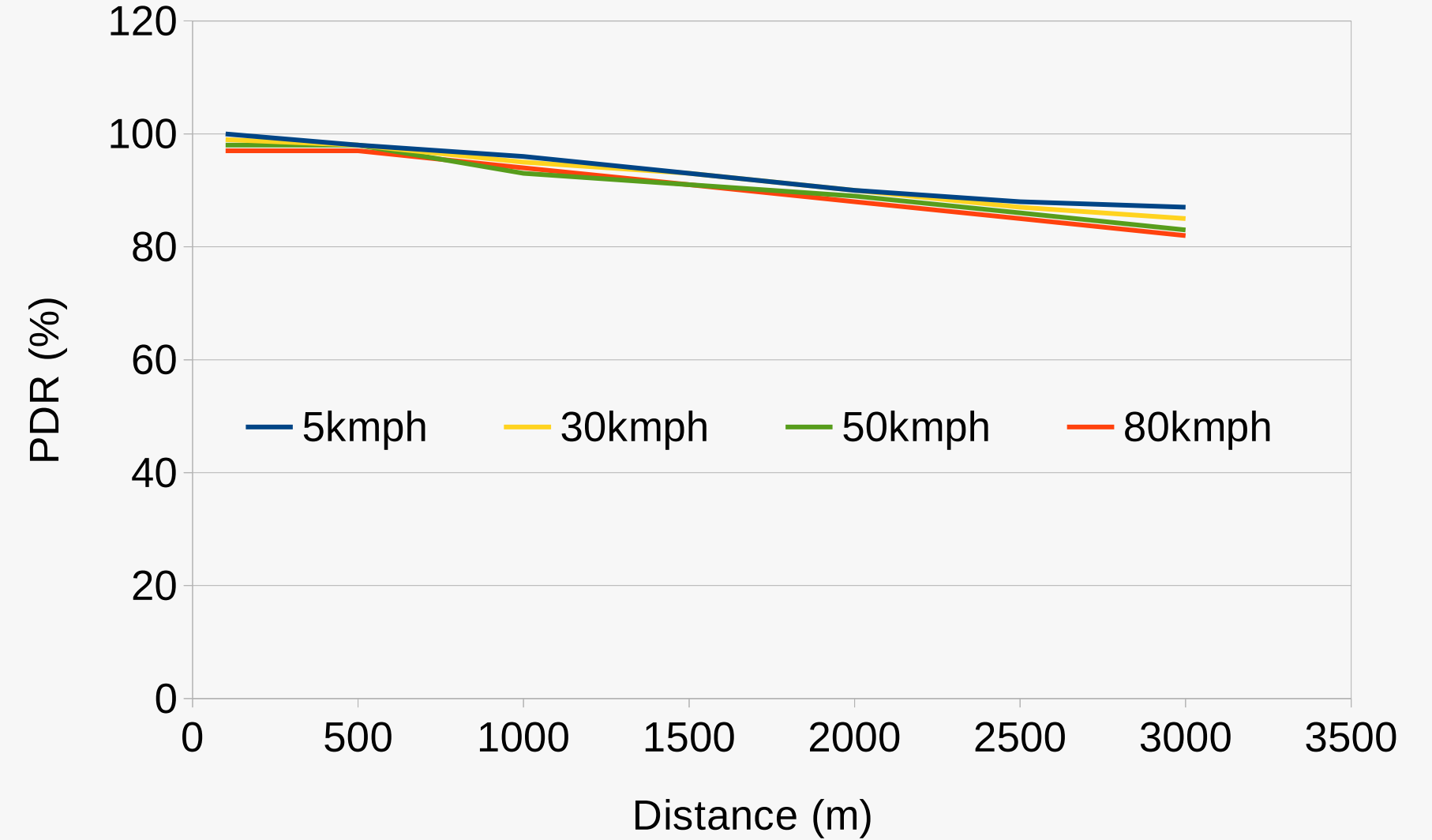
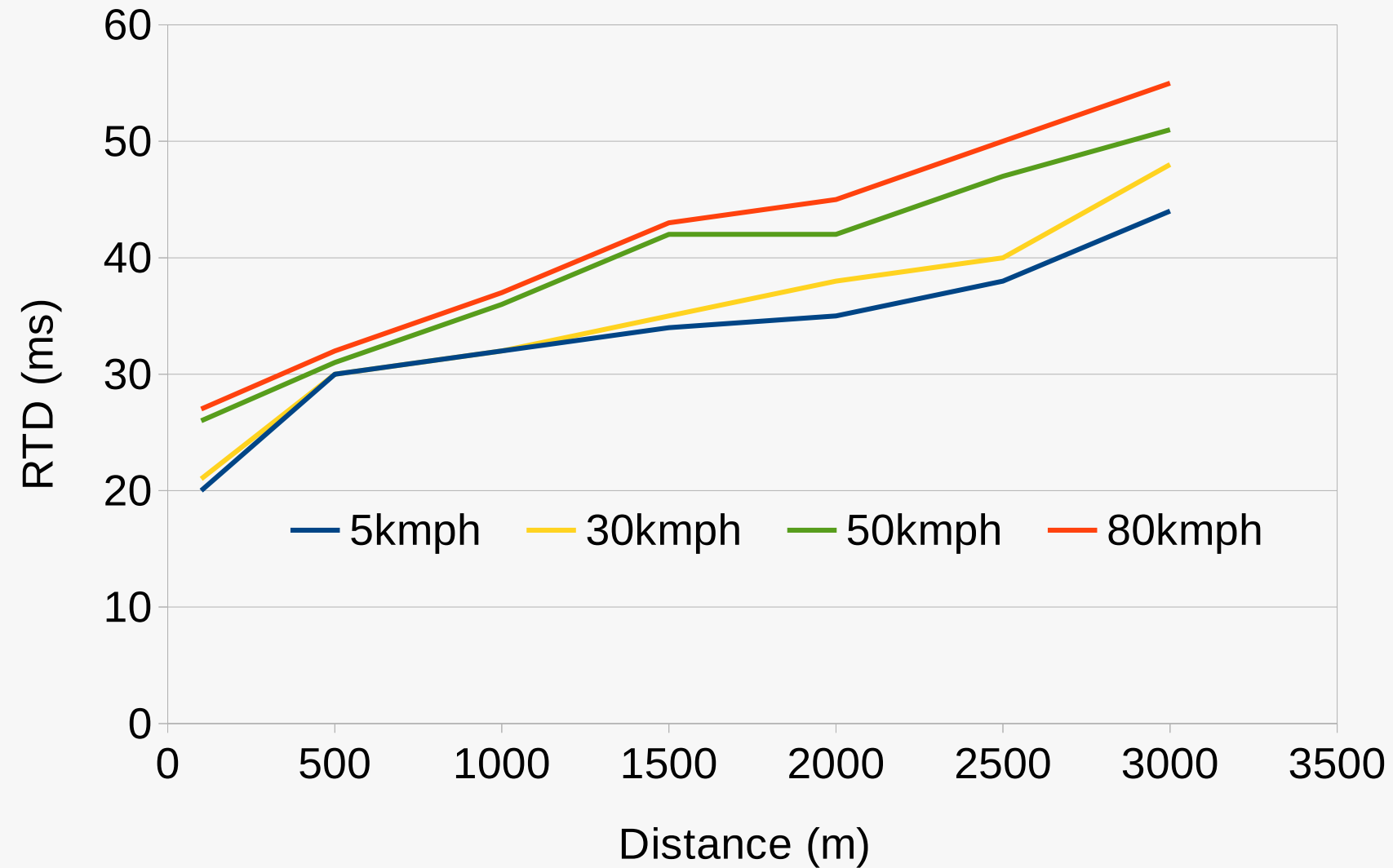


*3 Layers:*

- 1) *Crowd*
  - Refers to pedestrians and drivers
  - Data is sent to fog node every second
- 2) *Fog node*
  - Execute the collision prediction algorithm
  - Road segment covered by a single node depends on the communication technology used
- 3) *Cloud*
  - Performs aggregated analysis on data received from fog nodes for further use

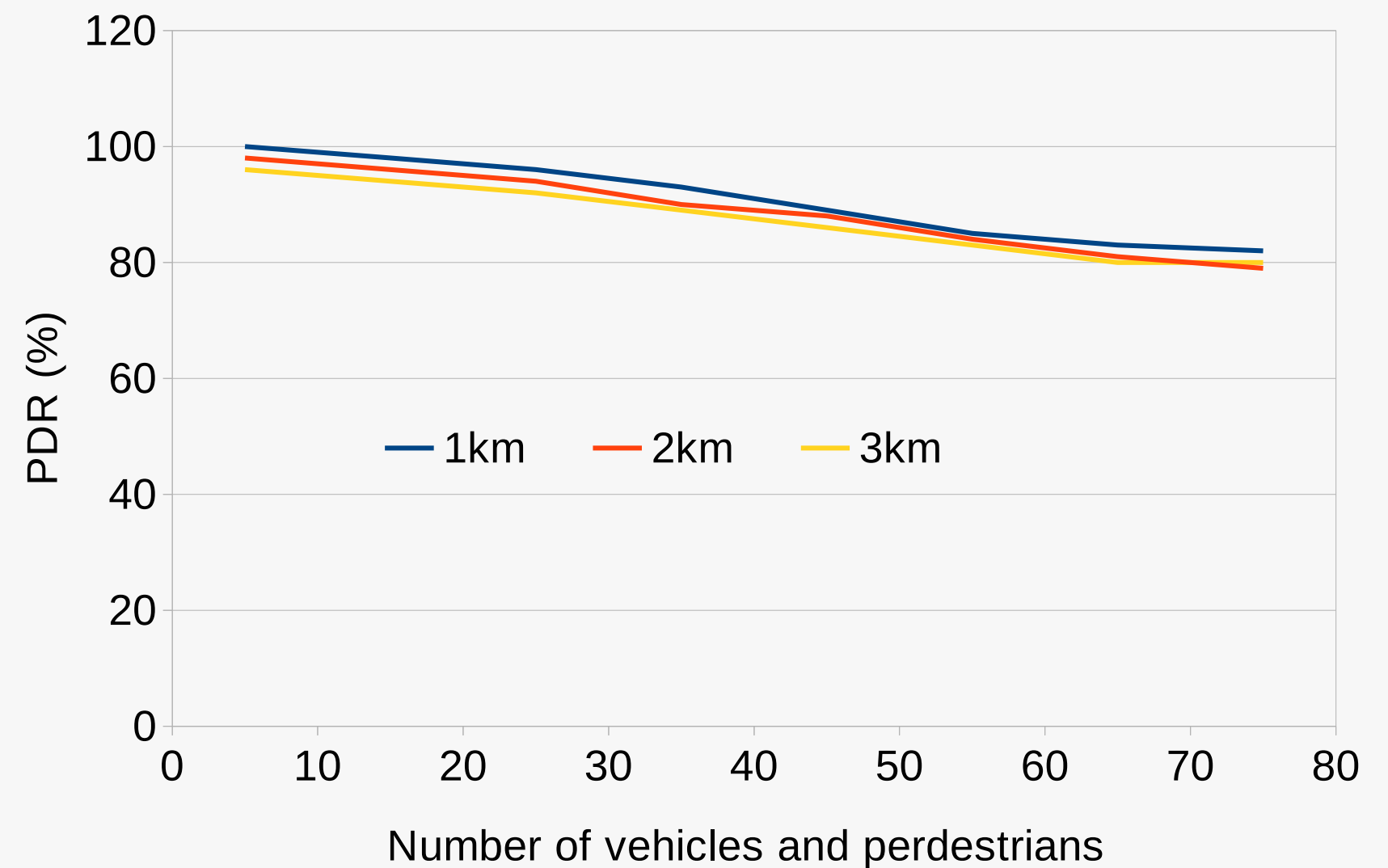
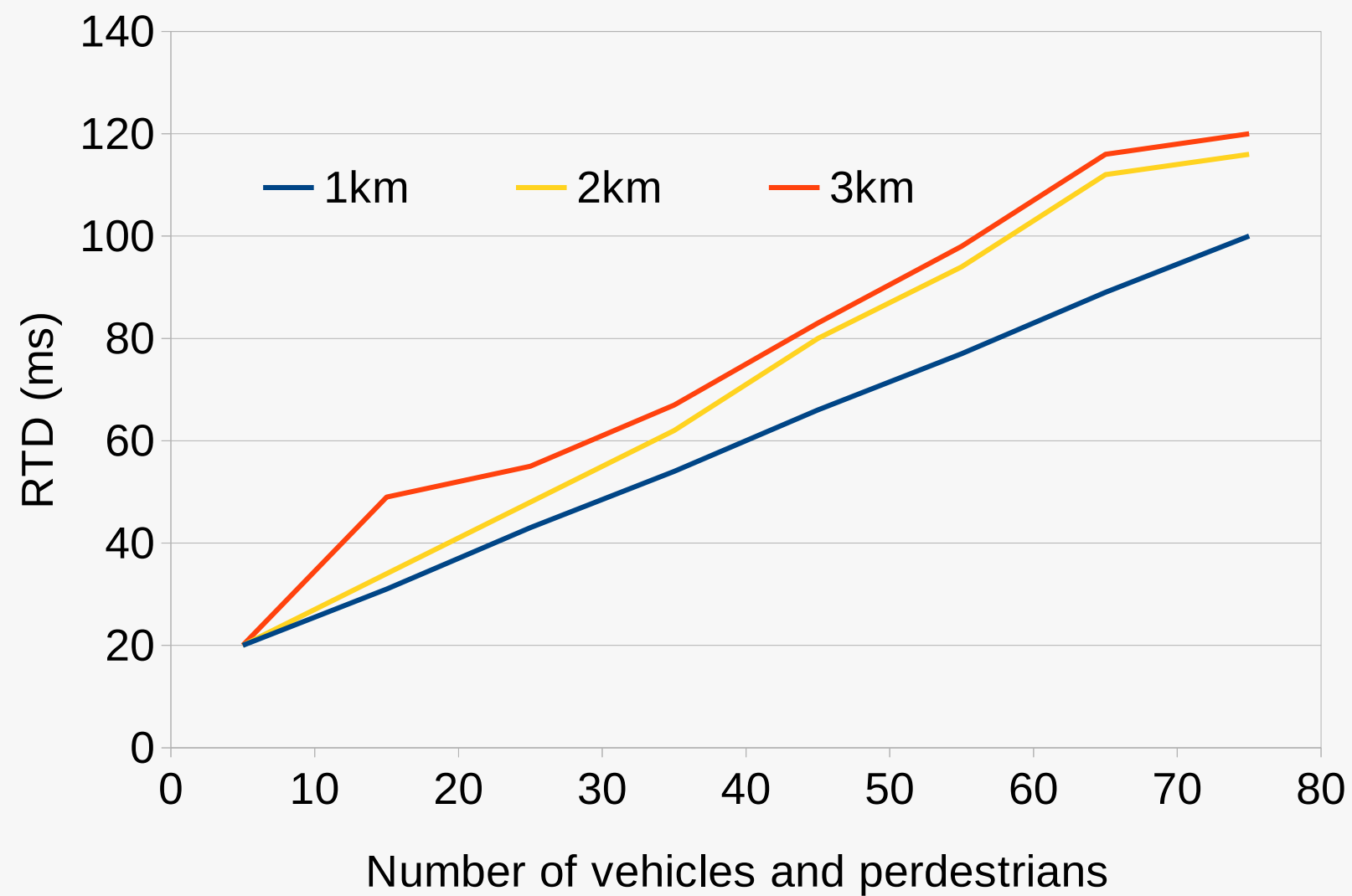
# LTE connection with the fog node

*High mobility support of LTE*



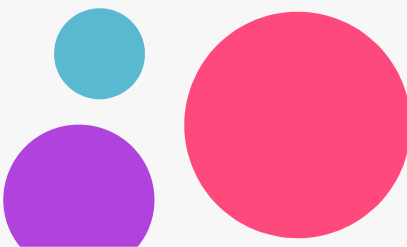
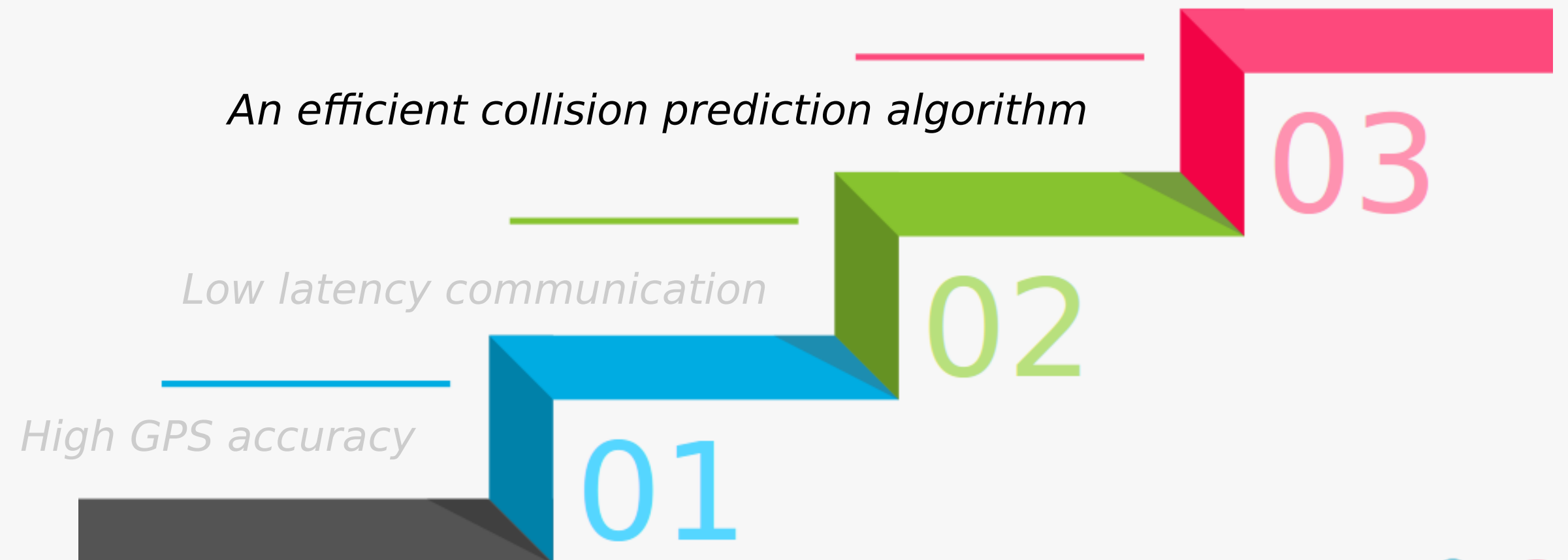
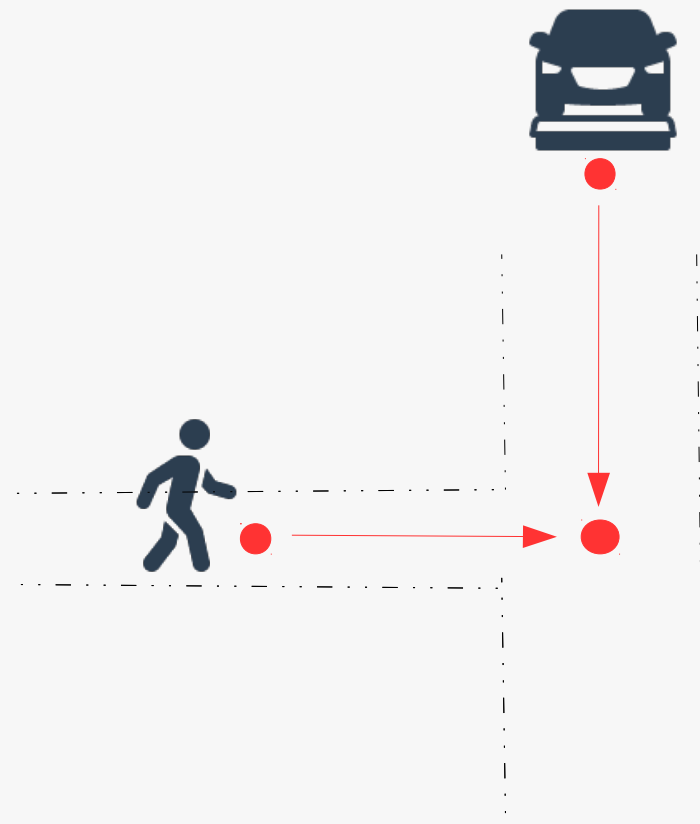
# LTE connection with the fog node

*Scalability of LTE*



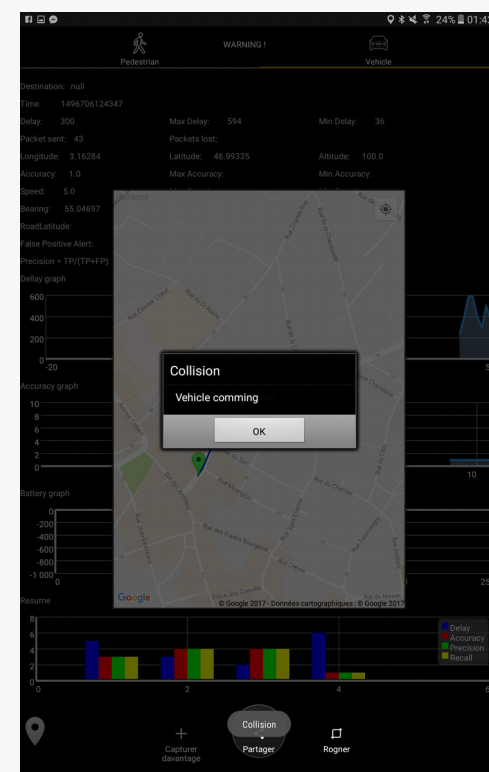
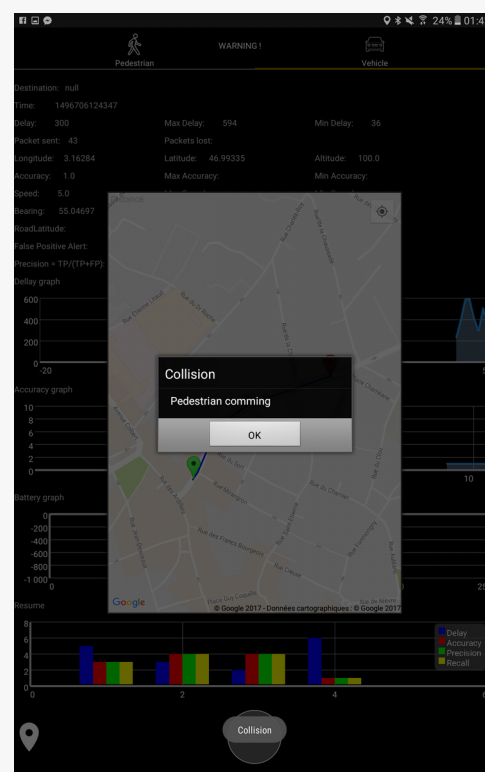
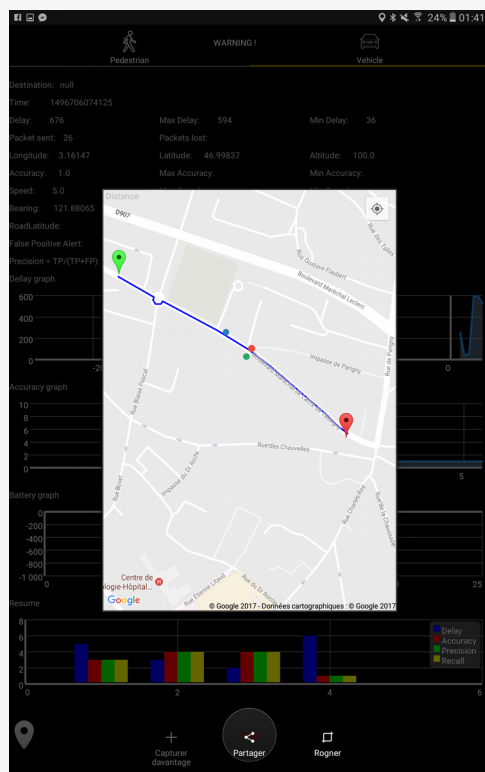
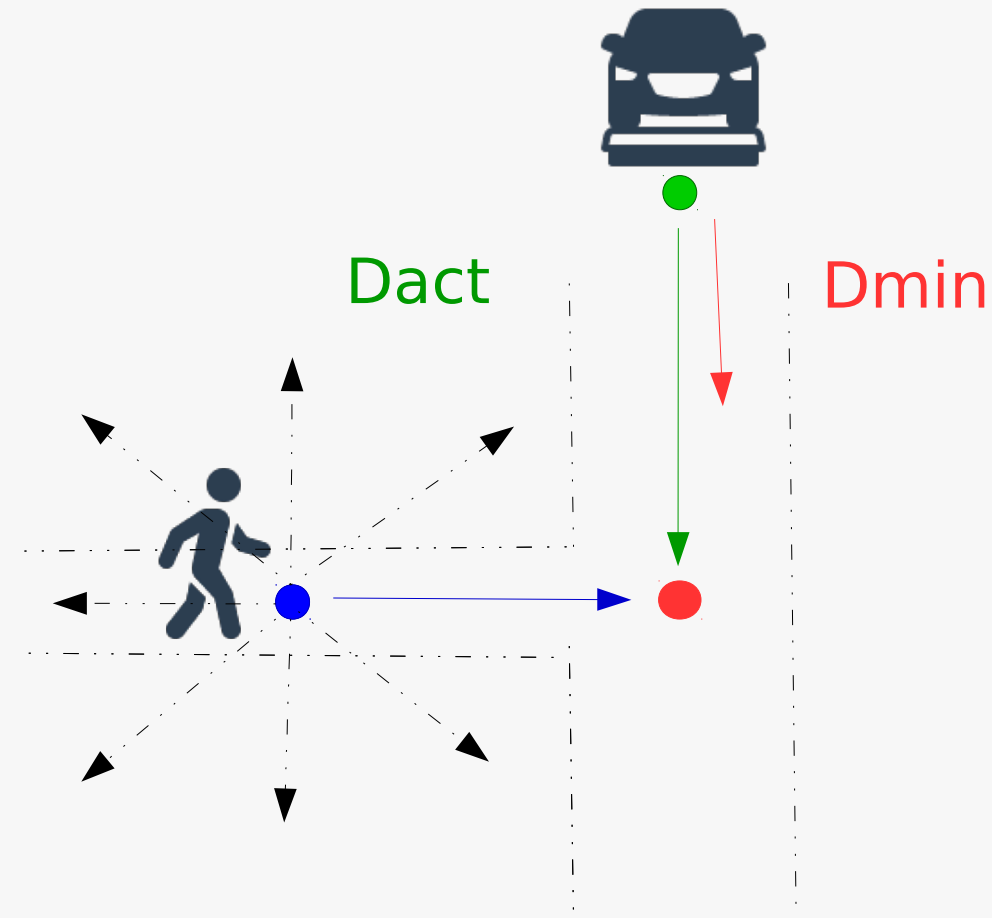
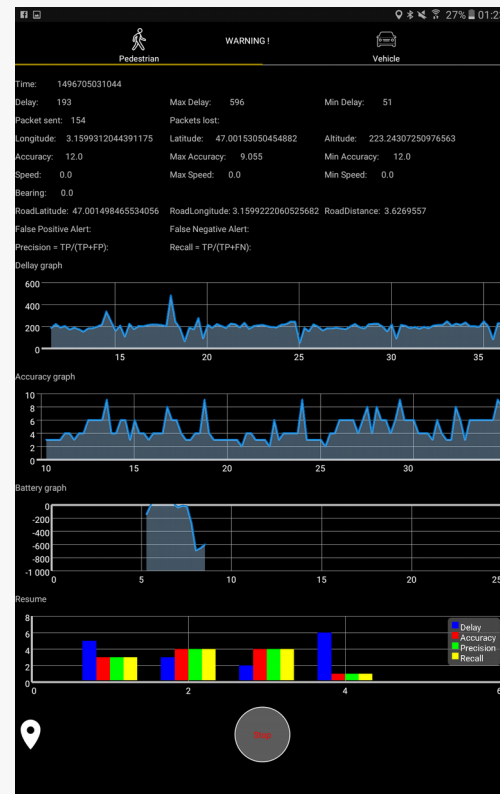
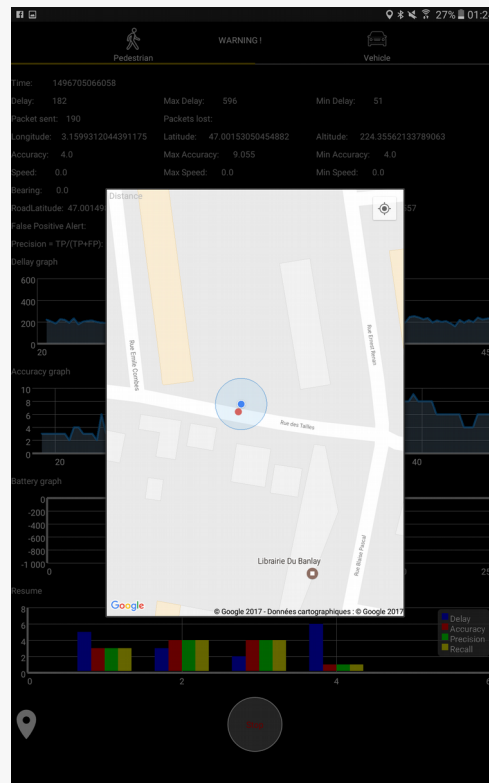
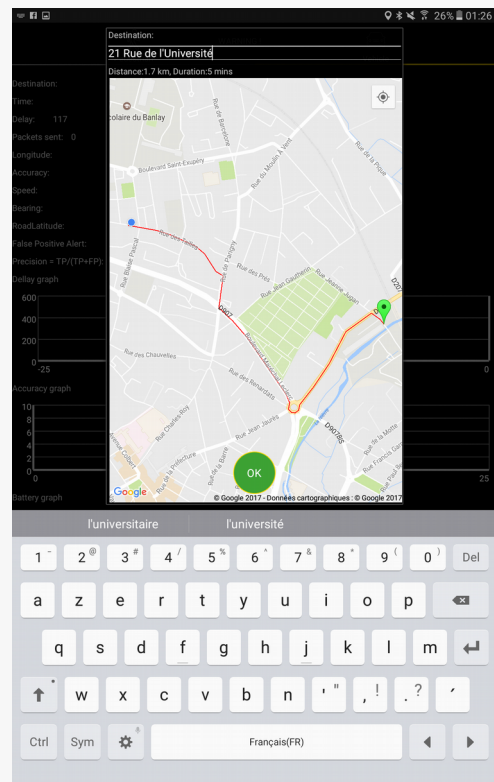
# Challenges

*Vulnerable road users alert system*



# Application

*Real environment*



*Algorithm:*

$$Dmin = V_{veh} * (T_p + T_r + T_{tx} + T_c) + GPS_{err-veh} + GPS_{err-ped}$$

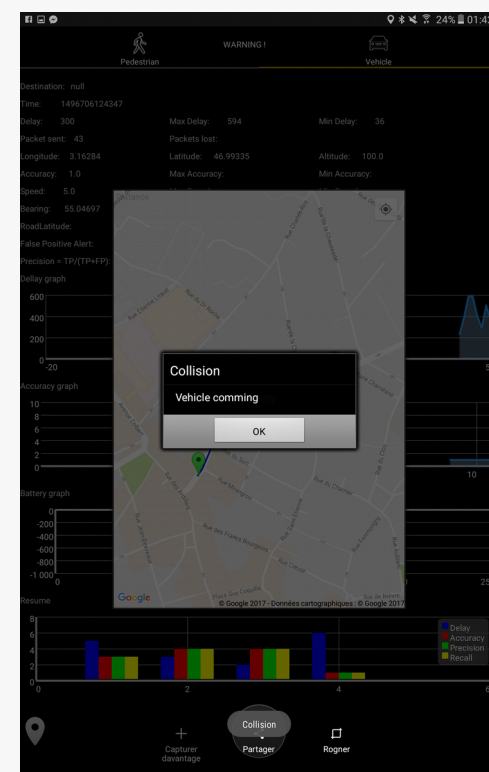
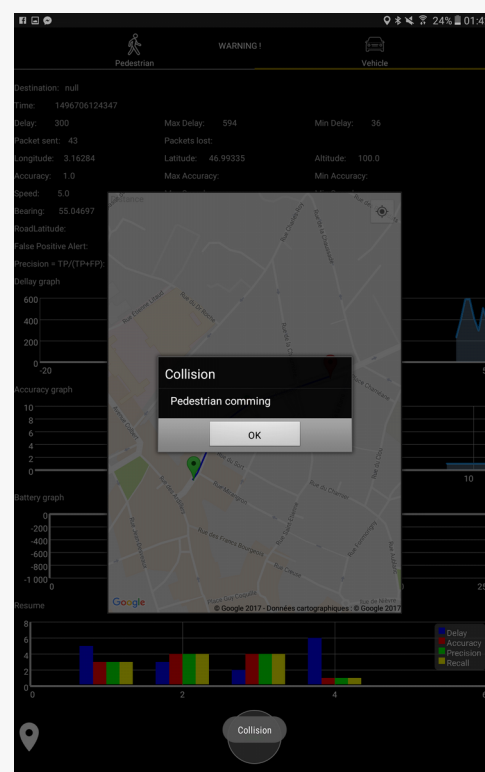
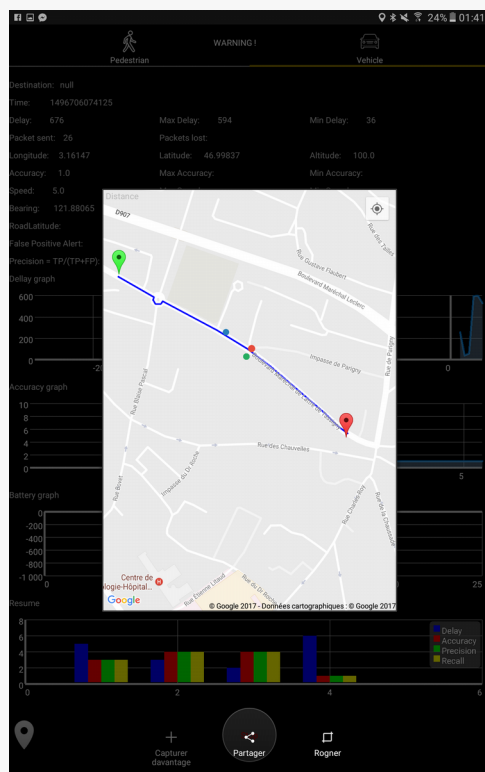
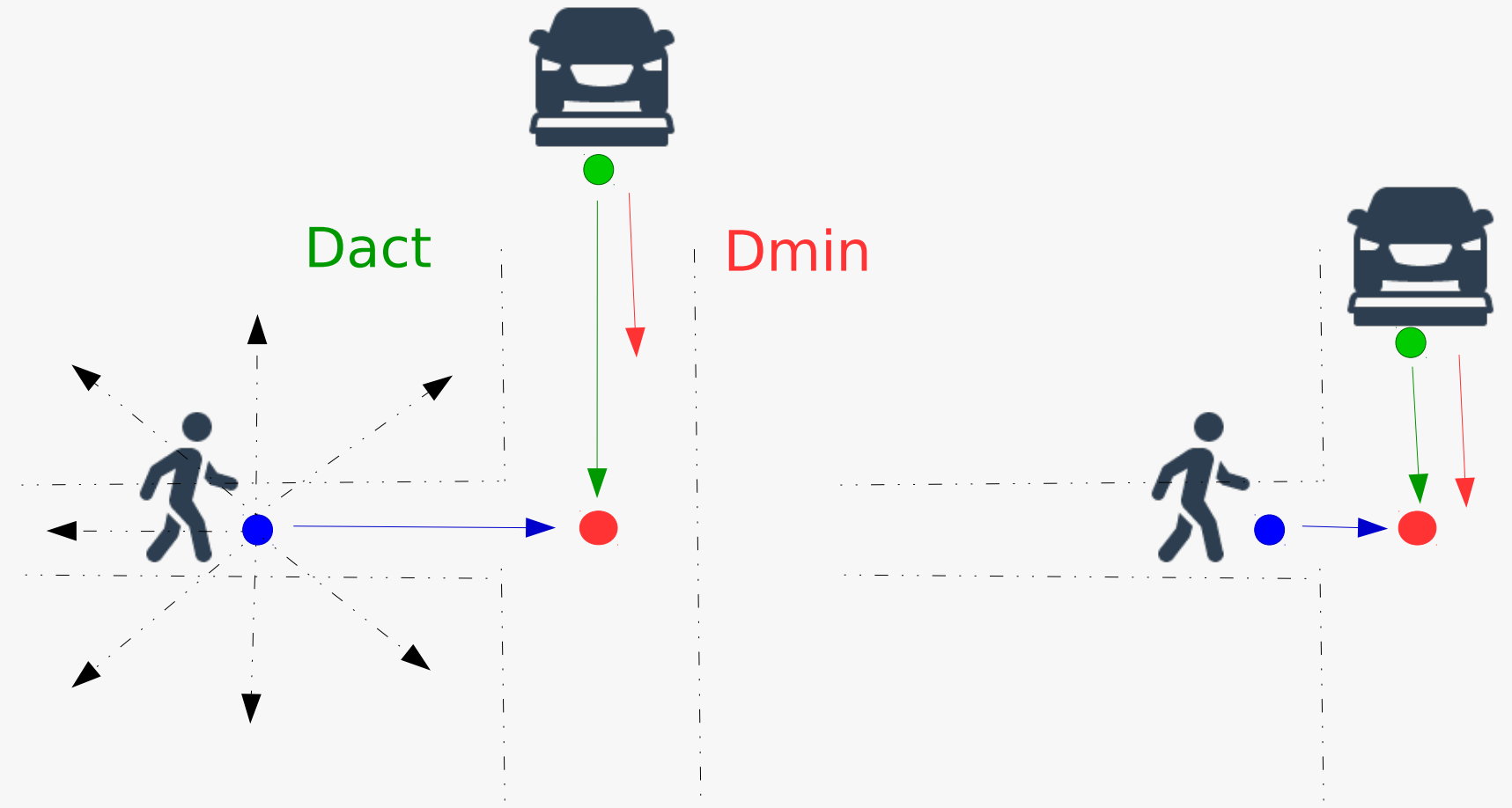
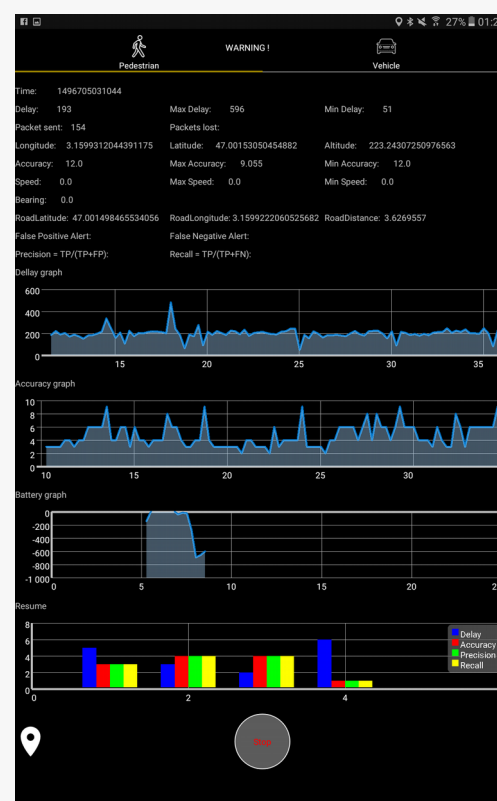
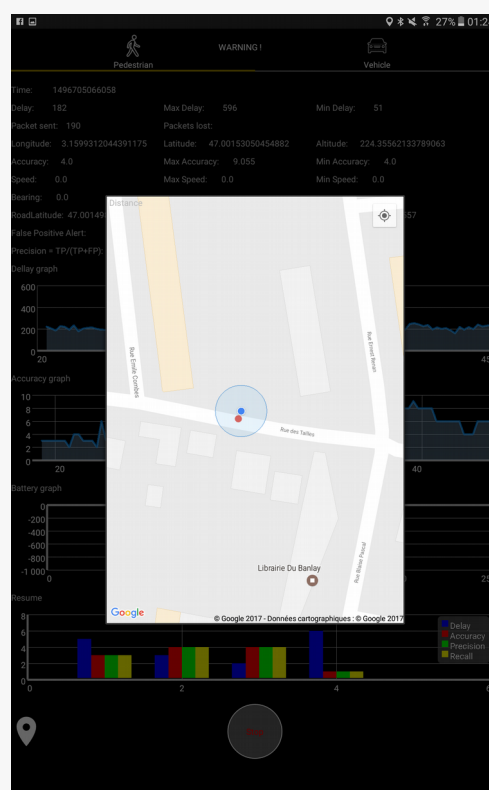
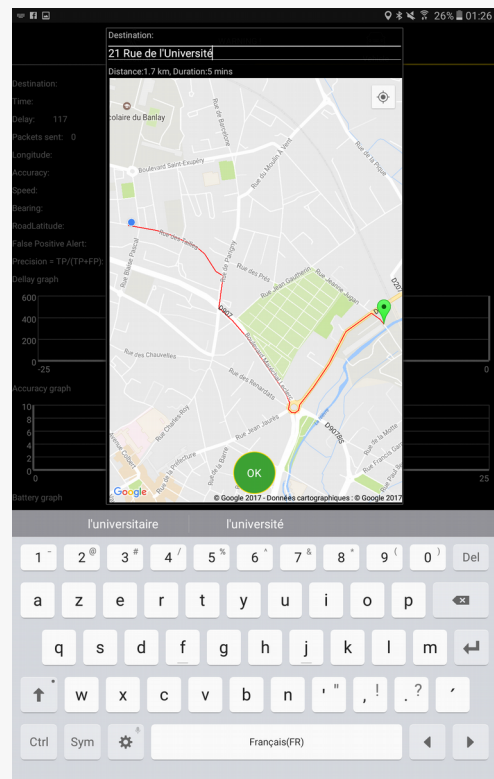
Application

18/19



# Application

Real environment



Algorithm:

$$Dmin = V_{veh} * (T_p + T_r + T_{tx} + T_c) + GPS_{err-veh} + GPS_{err-ped}$$

IF ( $Dact \leq Dmin$ ) send Alert **WARNING**

Application

18/19





# Conclusion

- 1) Map matching algorithm** with eight direction chain-code is easily applicable to car navigation and pedestrian navigation.*
- 2) Fog computing architecture** is a promising solution for problems that require low latency, high geographical distribution and high mobility support such as pedestrian collision prediction.*
- 3) Delay difference between fast-moving vehicles and slow-moving vehicles is not significant due to high mobility support of **LTE**.***

## **Future work:**

- 1) Adding new parameters in map matching algorithm that impact direction identification such the **signal strength** of each GPS point.***
- 2) Evaluating the efficiency of **map matching algorithm** and **Fog computing architecture** with **LTE connection** to reduce false positive alerts.***

# Thank You For Your Attention !

Any Questions ?

• • •