



Designing Vehicular Applications as Networked Multi-Agent Systems

Saeid Sabominiri / Pedro Santos

PDEEC - Special Topics / FEUP - U.Porto

2020/2021

Special Topics & Proposed Topic

- Special Topics:

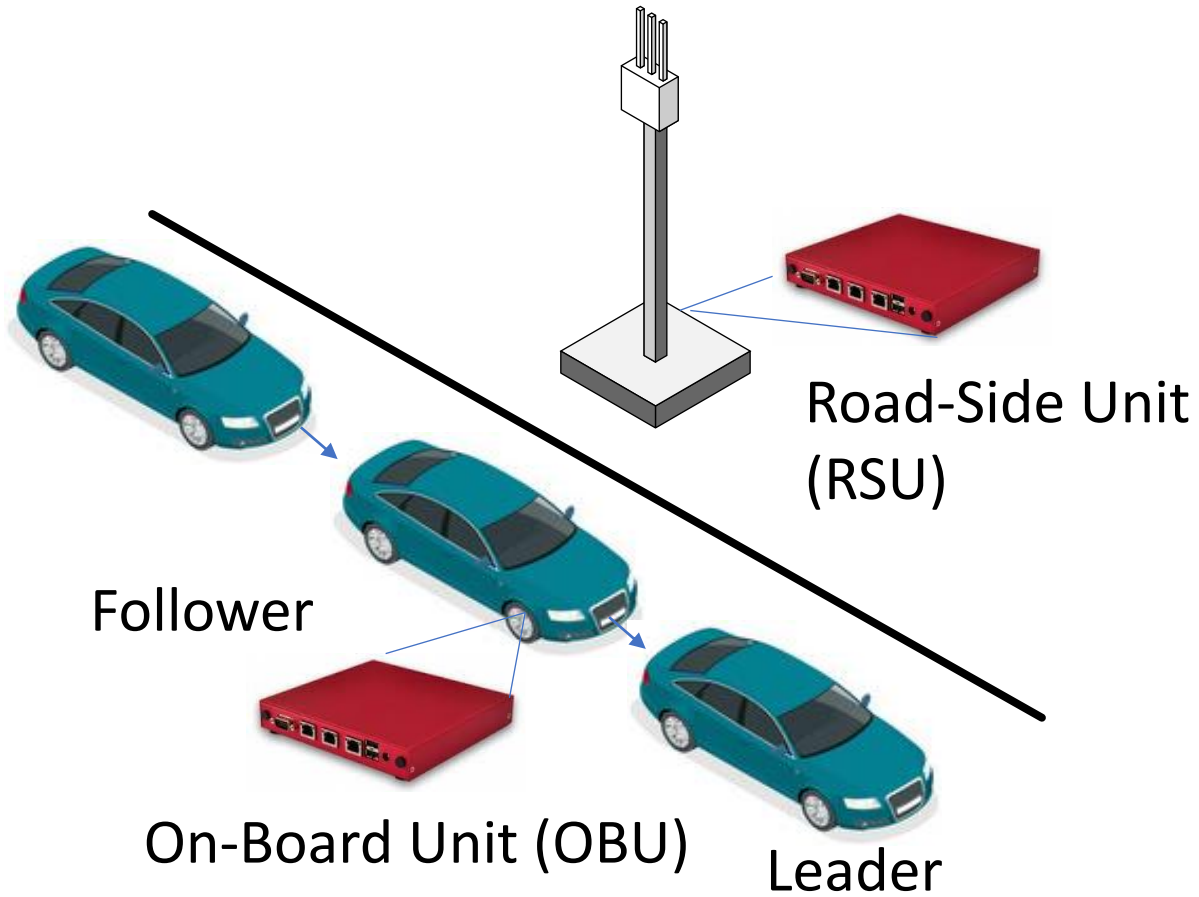
- Planned Individual Study (PIS) on a scientific topic not addressed in courses offered by PDEEC but considered relevant for the student's thesis. PIS must be supervised by a professor or a PhD researcher. **The final deliverable for PIS is a document reporting the original work** developed by the student during this study. Co-authorship in the context of this study is not allowed.

- Proposed topic:

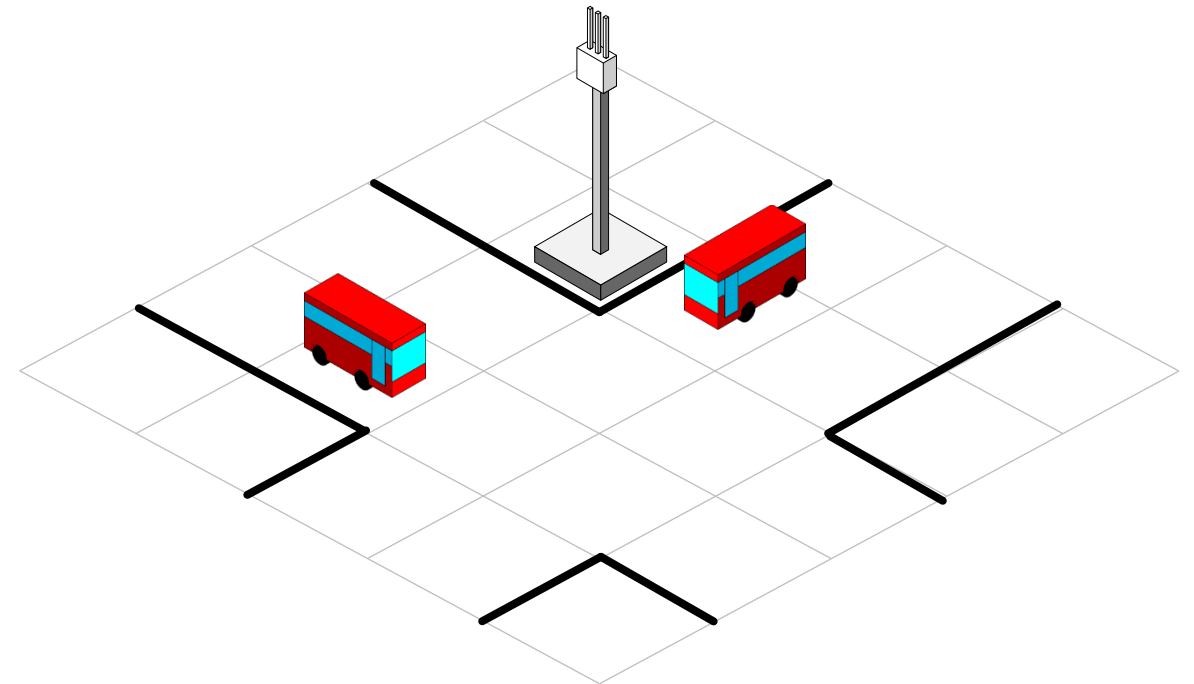
- **Designing Vehicular Applications as Networked Multi-Agent Systems**
- Communication and MAS approaches are relevant in vehicular scenarios
- Examples:
 - Platooning
 - Intersection
 - Lane merging

Examples

Platooning Application



Intersection Scenario



Course Structure

- 12 ECTS; 1 ECTS = 28 hours → Total: 336 hours (over 10-16 weeks ? → 12 weeks)
- Report: due by June 20
- Proposed Components:
 - Literature review (120 hours)
 - Project (180 hours)
- Two evaluation elements
 - Report on technological landscape of vehicular communications and MAS
 - Report of the developed project on simulation of MAS in a platooning context
- Interaction
 - Weekly contact hours to discuss articles and project progression



Calendar

		Lectures Content	Literature Review (120 hours)	Project steps (180 hours)
		Topic		
Week	Date			
0		Introduction		
1	31/03/2021	T1 Building Blocks for Vehicular Applications	Paper review	
2	08/04/2021	T2 Wireless Propagation	Paper review (to include in report)	Define scenario and simulation tools
3	15/04/2021	T3 Communication Arch. and Open V2X Standards	Paper review (to include in report)	Define scenario and simulation tools
4	22/04/2021	- Discussion on literature and project		Setup of simulation scenario
5	29/04/2021	T4 Cellular Technological Ecosystem	Paper review (to include in report)	Setup of simulation scenario
6	06/05/2021	T5 Simulation Tools	Paper review	Agent modelling
7	13/05/2021	T6 Co-existence & Other Technologies	Paper review	Agent modelling
8	20/05/2021	Project Discussion	Discussion	Communication protocols
9	27/05/2021	Project Discussion	Discussion	Communication protocols
10	02/06/2021 (Wed)	Project Discussion	Discussion	Application performance metrics
11	10/06/2021	Project Discussion	Discussion	Application performance metrics
12	17/06/2021	Review report	Discussion	Report

Background & Logistics

- Recommended Literature

- Networking

- Andrew S. Tanenbaum and David J. Wetherall. 2010. **Computer Networks** (5th. ed.). Prentice Hall Press, USA.
 - Slides by I. Radovanovic

- Multi-agents

- Michael Wooldridge; An introduction to multiagent systems. ISBN: 978-0-470-51946-2 (2nd Edition, 2009).

- Machine Learning

- Christopher M. Bishop. 2006. Pattern Recognition and Machine Learning (Information Science and Statistics). Springer-Verlag, Berlin, Heidelberg.

- Logistics

- Conference tool - Zoom
 - Shared folder – Gdrive
 - Meeting time : Thursday 2:30pm Tehran time / 11am Lisbon time

Literature Review

Report on Literature

- **Components**
 - Wireless Technologies – Literature review
 - Multi-Agent Systems – Slide set – **Due by 26/05/2021**
- **Literature Review**
 - Describe each paper you read on the topic – 1 to 2 paragraphs
 - Write your view on the selected topics – 3 to 5 paragraphs
 - Topics to address
 - Wireless Propagation
 - Open V2X Standards
 - Cellular Technological Ecosystem
 - Structure of document
 - Introduction
 - Section per topic
 - Conclusion
- **Slide set**

Project

Outline for Project

- Goal

- Develop simulation of vehicular scenario with vehicle-to-vehicle and to-infrastructure (V2V/V2I) communication
- Vehicles and infrastructure modelled as agents
- Implement and evaluate vehicular application involving infrastructure

- Steps:

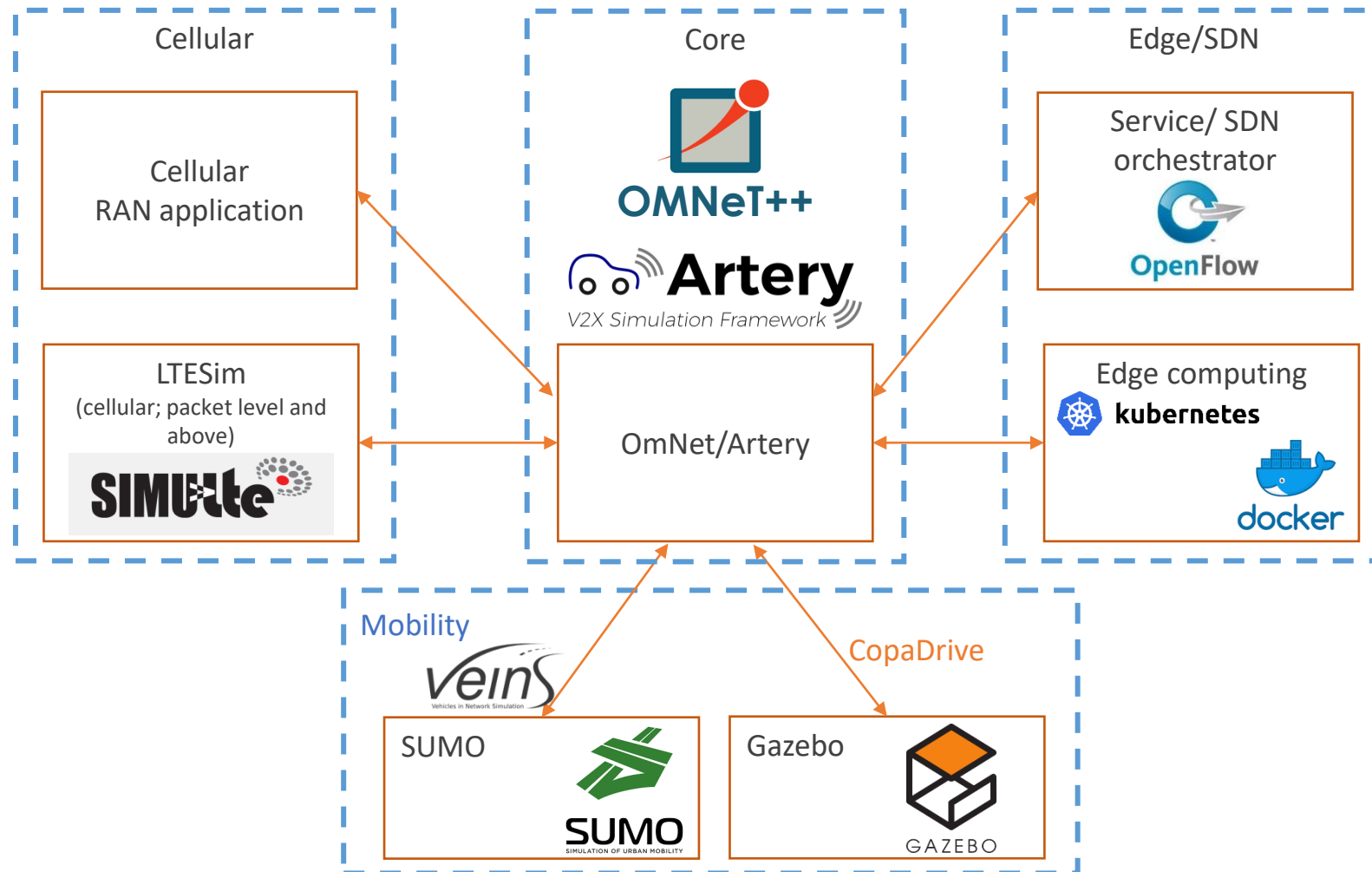
1. Define scenario and simulation tools
2. Setup of simulation scenario
3. Agent modelling
4. Communication protocols
5. Application performance metrics
6. Report

Detailed Workplan for Project

Stages:

1. Define scenario and simulation tools
 1. Identify vehicular application, design scenario and describe multi-agent behaviour
 2. Identify technologies – IEEE 802.11p and/or cellular – and simulation technologies to use – OMNeT++, SUMO or Gazebo, Artery)
2. Setup of simulation scenario (2-3)
 - Setup simulation environment
 - Set up mobility or control model of vehicles
 1. Test sending/reception of messages
3. Agent modelling (1-2)
 - Code agent behaviour (C++)
4. Communication protocols (1-2)
 - Map information to be conveyed between agents into communication protocol format
5. Performance metrics (2-4)
 - Identify performance metrics of application or communication
 - Design experiments
 - Collect logs & plot metrics
6. Write report (1-2)

Simulation Tools



Stage 1: Scenario Description

Setting	Intersection, highway, etc.
Vehicular application	Emergency breaking, traffic light coordination, etc.
Requirements on communication layer	End-to-end transmission time
Agents and their behaviour	Mobility of individual vehicles; decision-making processes
Metrics of performance of application or communications	How often
...	

Project Report

- Structure
 - Introduction
 - Scenario and Proposed Application
 - Implementation
 - Evaluation
 - Conclusion

T1. Building Blocks for Vehicular Applications

1. Building Blocks for Vehicular Applications

- Building Blocks:
 - Sensorization
 - Intelligence
 - Communication
- Relevant organizations in the area:
 - 5GAA – <https://5gaa.org/>
 - 5G-ACIA – <https://www.5g-acia.org/>
 - Projects – <https://platooningensemble.eu/>

Use-Cases & Requirements for Applications

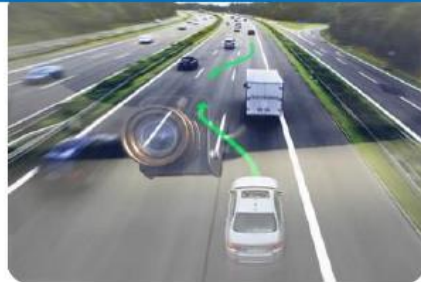
Uses cases for **autonomous driving** applications (SA1 TR22.886)



Vehicle
Platooning



Remote Driving



Cooperative Operation,
Sensor sharing



Advanced Driving

NR-V2X requirements for **autonomous driving** (SA1 TS22.186)

Use Cases	E2E latency (ms)	Reliability (%)	Data rate (Mbps)
Vehicle Platooning	10	99.99	65
Advanced Driving	3	99.999	53
Extended Sensors	3	99.999	1000
Remote Driving	5	99.999	UL:25, DL:1
	Lateral (m)	Longitudinal (m)	
Positioning Accuracy	0.1	0.5	

Note: 5GAA may adjust the above requirements according to inputs from car OEMs.

<Missing source>

To Read & Discuss

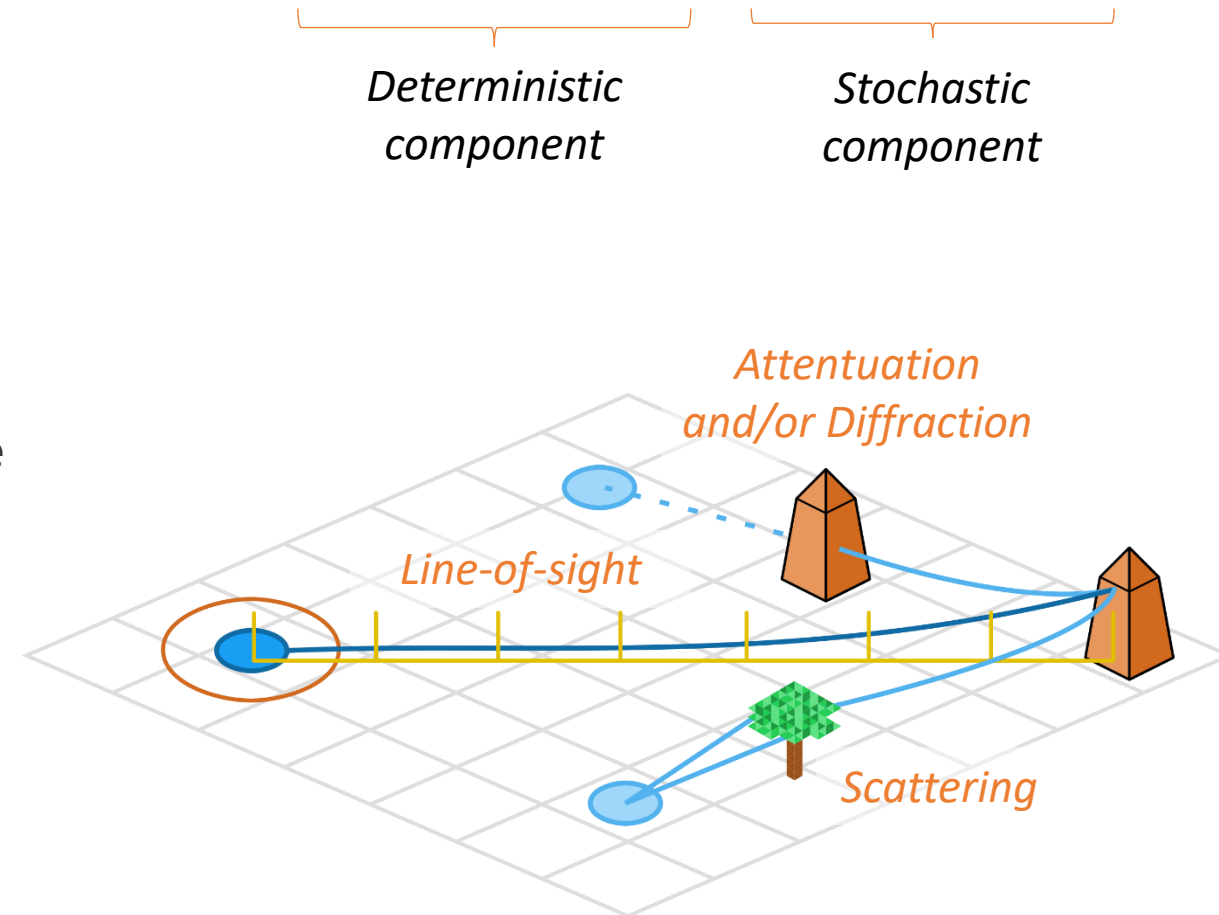
- E. V. Filho et al., "Towards a Cooperative Robotic Platooning Testbed"
- B. Vieira et al. "COPADRIVE - A Realistic Simulation Framework for Cooperative Autonomous Driving Applications"
- 5GAA, "C-V2X Use Cases Volume II: Examples and Service Level Requirements"
- 5G-PPP, "5G Automotive Vision"

T2. Wireless Propagation

Propagation Modelling

- Components of a propagation model
 - **Large-scale Propagation**
 - Typically deterministic
 - **Small-scale Fading**
 - Typically stochastic
- Classes of Propagation Models
 - **Parametric:** parameter values already available
 - Free-space path loss (FSPL)
 - Two-ray ground reflection model
 - ...
 - **Empirical:** drawn from measurements
 - Empirical log-distance path loss

$$\rho_{[\text{dBm}]}(d) = \underbrace{\rho_0 - 10 \alpha \log \left(\frac{d}{d_0} \right)}_{\text{Deterministic component}} + \underbrace{X_\rho}_{\text{Stochastic component}}, \quad X_\rho \sim N_{\sigma_\rho}$$

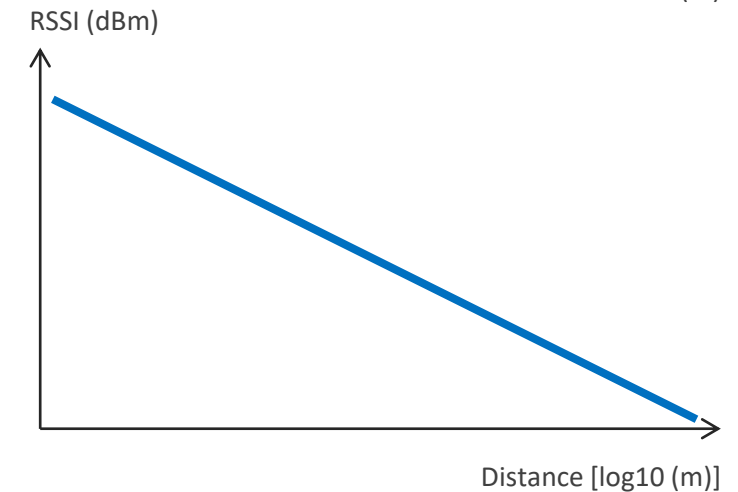
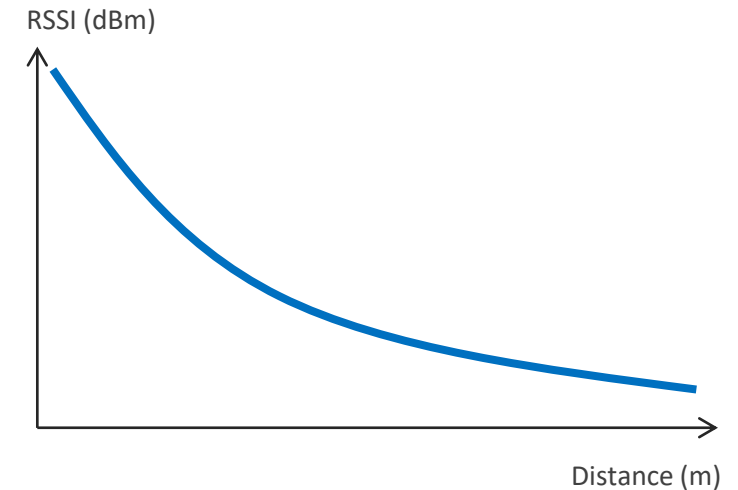


Propagation Modelling

- Components of a propagation model
 - **Large-scale Propagation**
 - Typically deterministic
 - **Small-scale Fading**
 - Typically stochastic
- Classes of Propagation Models
 - **Parametric:** parameter values already available
 - **Free-space path loss (FSPL)**
 - Two-ray ground reflection model
 - ...
 - **Empirical:** drawn from measurements
 - Empirical log-distance path loss

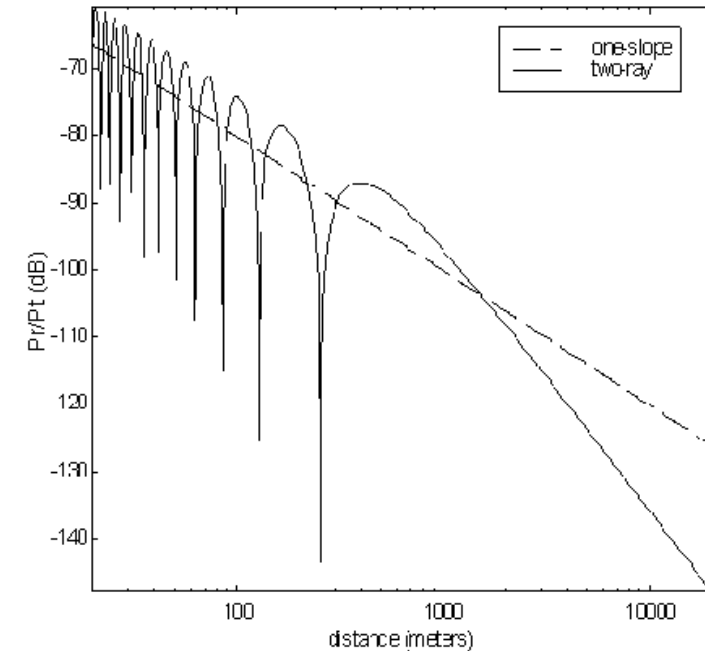
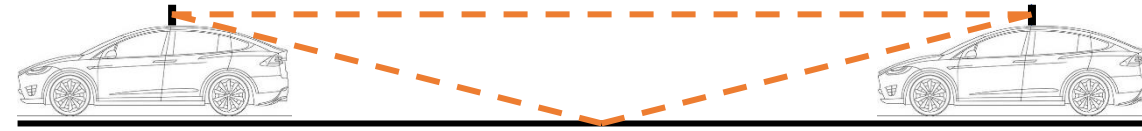
$$\text{FSPL} = \left(\frac{4\pi df}{c} \right)^2$$

$$\text{FSPL(dB)} = 20 \log_{10}(d) + 20 \log_{10}(f) + 20 \log_{10} \left(\frac{4\pi}{c} \right)$$



Wireless Propagation

- Components of a propagation model
 - **Large-scale Propagation**
 - Typically deterministic
 - **Small-scale Fading**
 - Typically stochastic
- Classes of Propagation Models
 - **Literature:** parameter values already available
 - Free space path loss (FSPL)
 - **Two-ray ground reflection model**
 - ...
 - **Empirical:** drawn from measurements
 - Empirical path loss

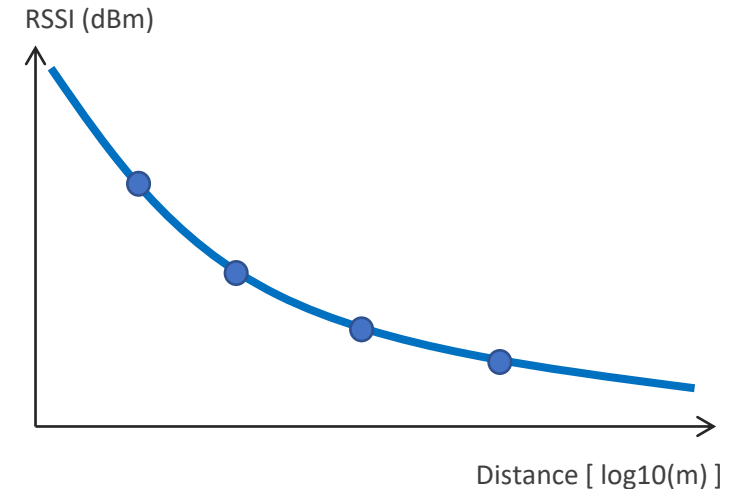


Thomas Schwengler. *Wireless and Cellular Communications*.
<http://morse.colorado.edu/~tlen5510/text/classwebch3.html>

Wireless Propagation

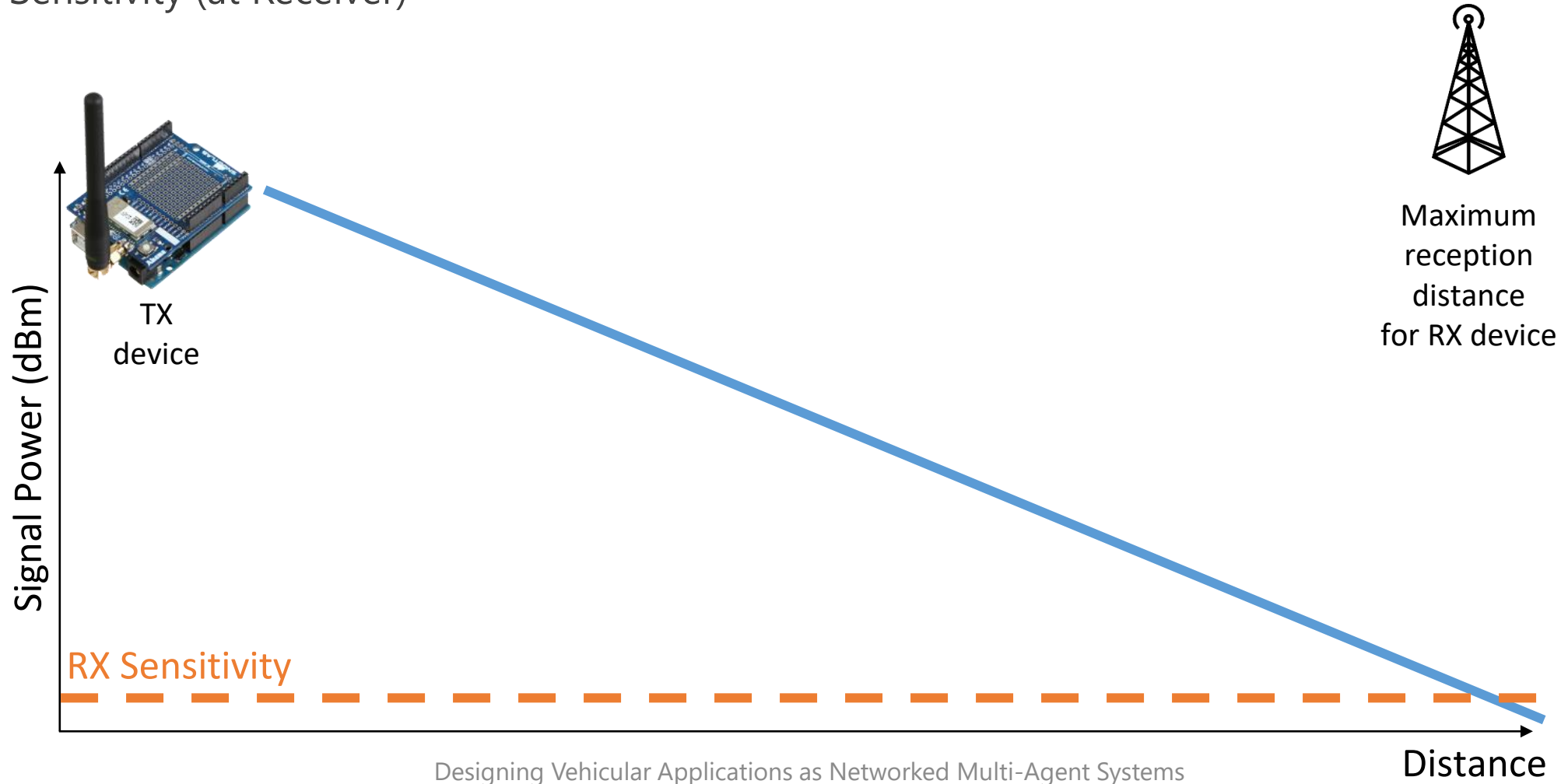
- Components of a propagation model
 - **Large-scale Propagation**
 - Typically deterministic
 - **Small-scale Fading**
 - Typically stochastic
- Classes of Propagation Models
 - **Parametric:** parameter values already available
 - Free space path loss (FSPL)
 - Two-ray ground reflection model
 - ...
 - **Empirical:** drawn from measurements
 - **Empirical path loss**

$$\rho_{[\text{dBm}]}(d) = \rho_0 - 10 \alpha \log \left(\frac{d}{d_0} \right) + X_\rho, \quad X_\rho \sim N_{\sigma_\rho}$$



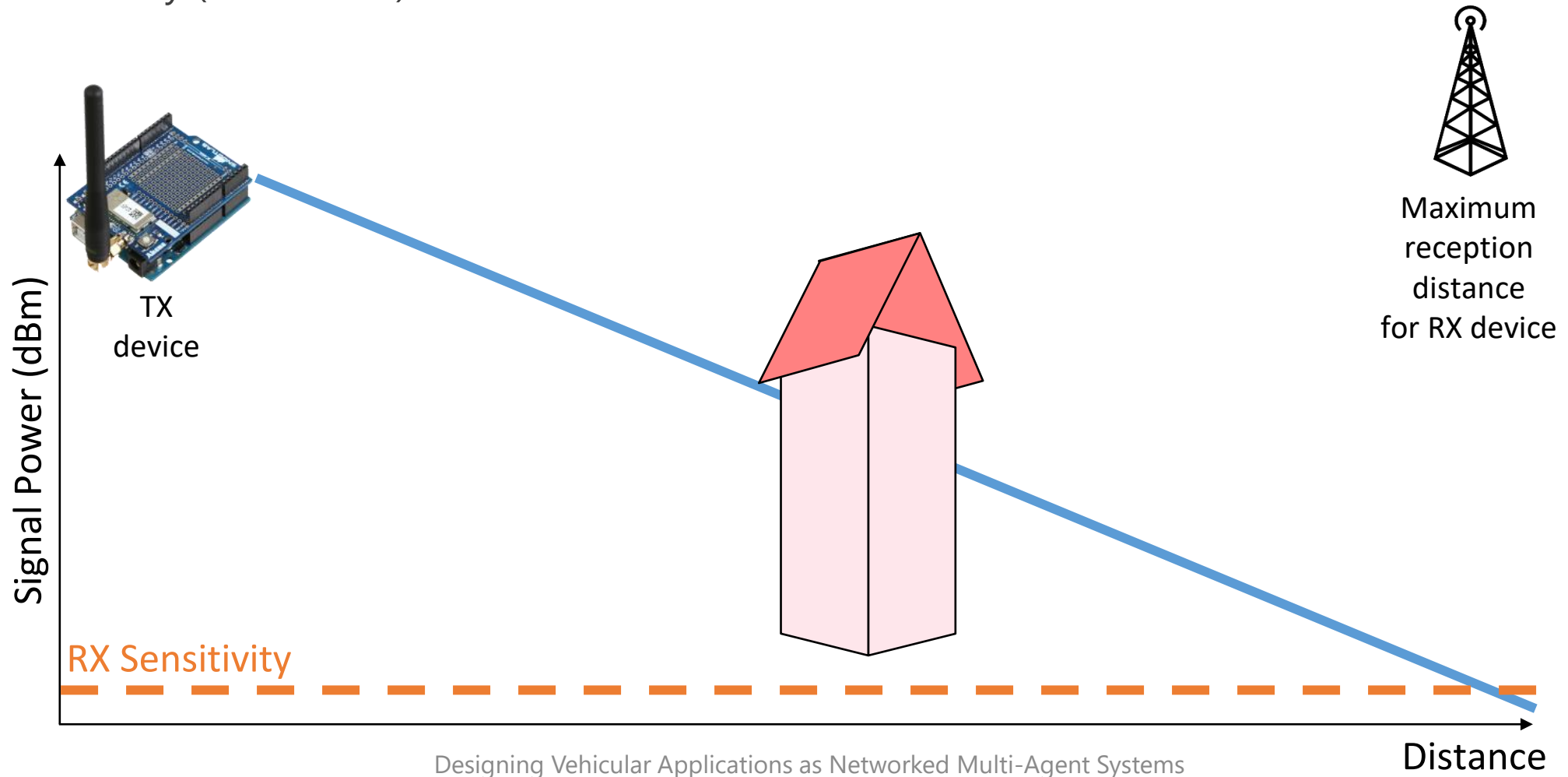
Link Budget

- Transmit power (Transmitter)
- Sensitivity (at Receiver)



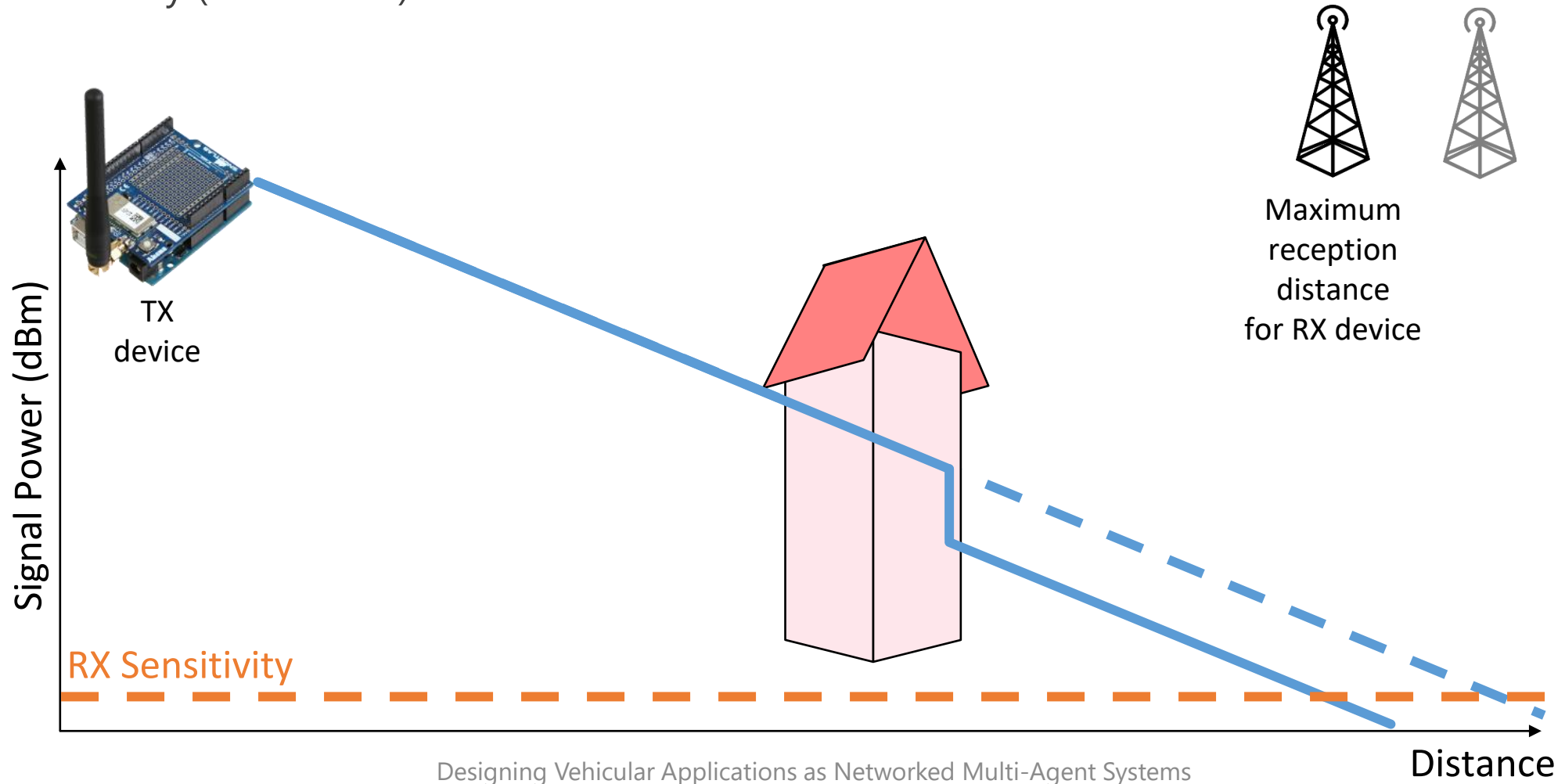
Link Budget

- Transmit power (Transmitter)
- Sensitivity (at Receiver)



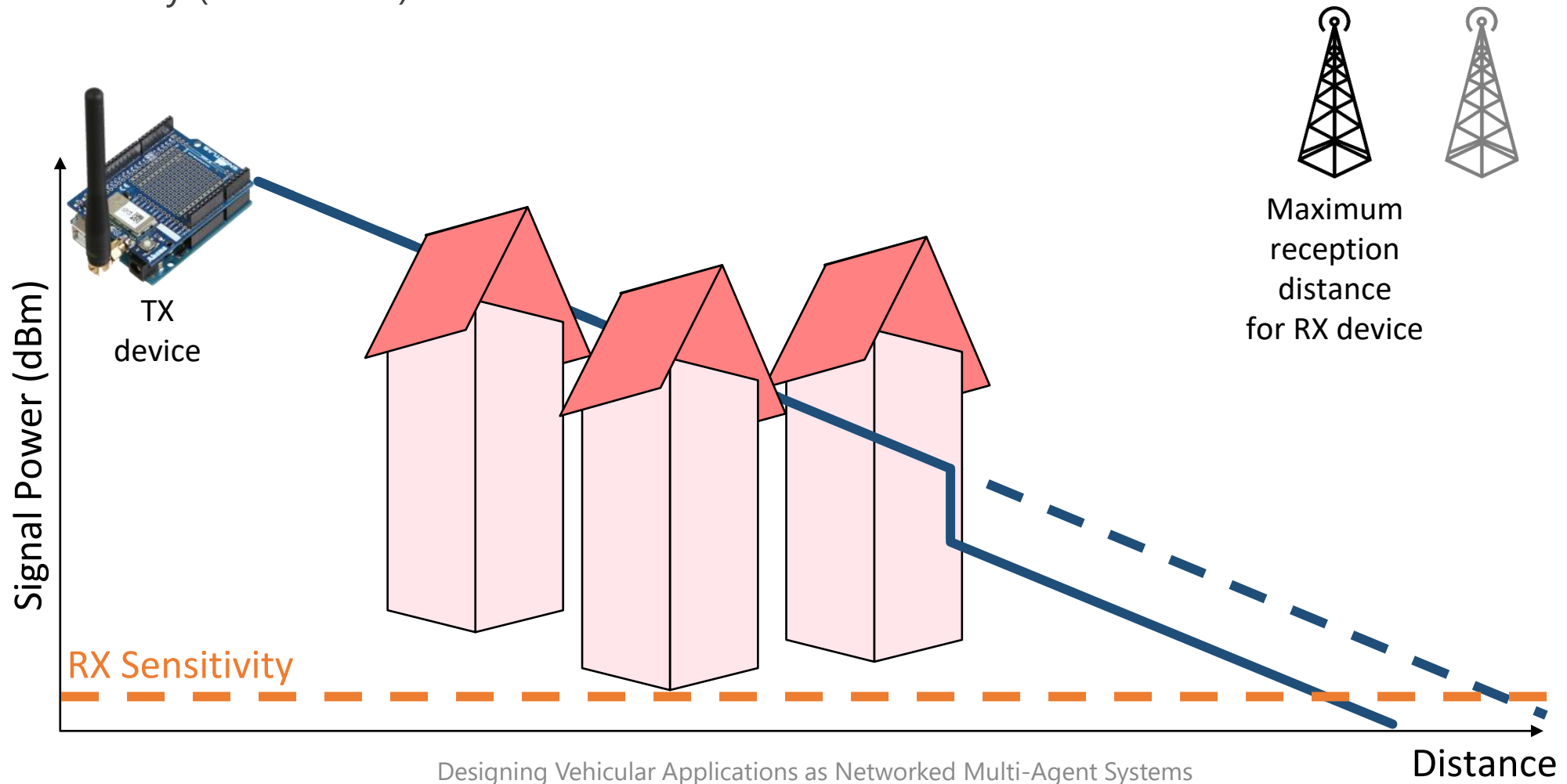
Link Budget

- Transmit power (Transmitter)
- Sensitivity (at Receiver)



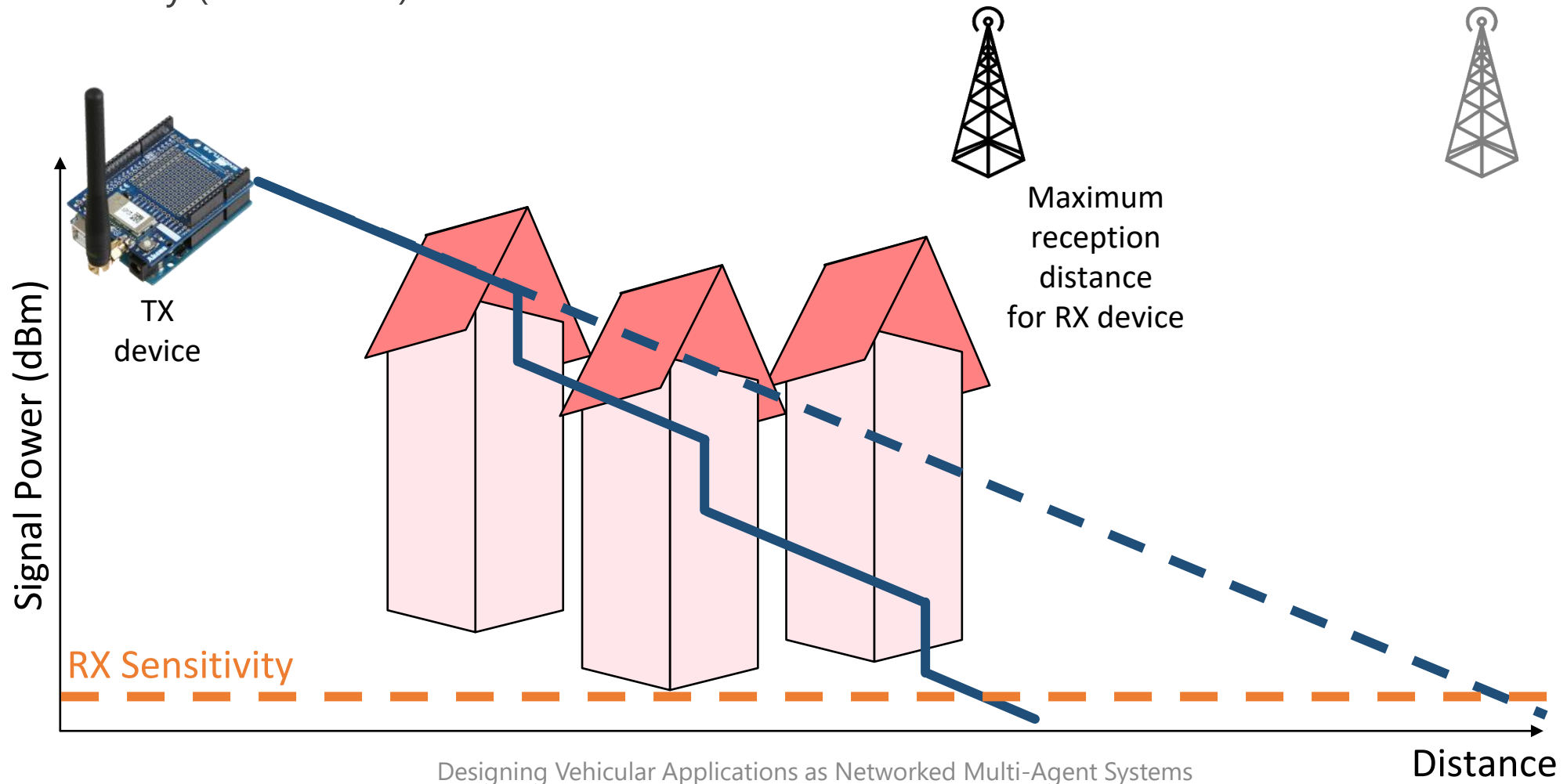
Link Budget

- Transmit power (Transmitter)
- Sensitivity (at Receiver)



Link Budget

- Transmit power (Transmitter)
- Sensitivity (at Receiver)



To Read & Discuss

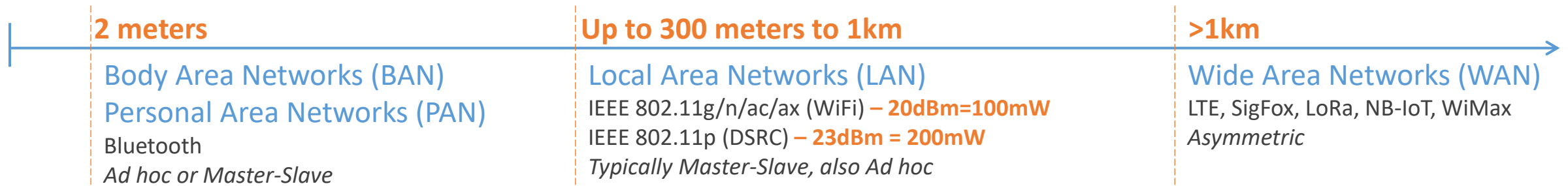
- W.Viriyasitavat et al., “Vehicular Communications Survey and Challenges of Channel and Propagation Models”
- R.Meixeles et al., “Experimental study on the impact of vehicular obstructions in VANETs”

T3. Communication Architectures & Open V2X Standards

15/04/2021

Network Scale and Communication Architecture

- Depending on the communication technology, networks can operate at various scales



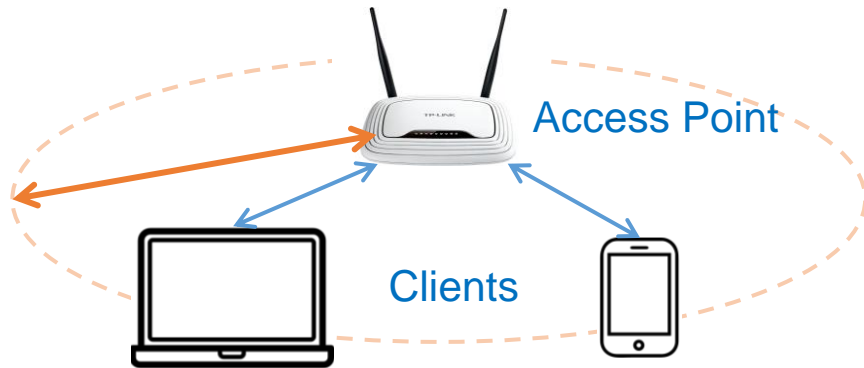
- Communication architectures can take typically one of shapes
 - **Symmetric:** both transmitter and receiver have similar capabilities (similar transmit power and sensitivity)
 - Typically found in small-to medium scale networks (BAN, LAN)
 - **Assymmetric:** one of the transceivers is more powerful than the other (higher transmit power and higher sensitivity)
 - Typical of cellular architectures (WAN)

Technologies of LAN and WAN

LAN

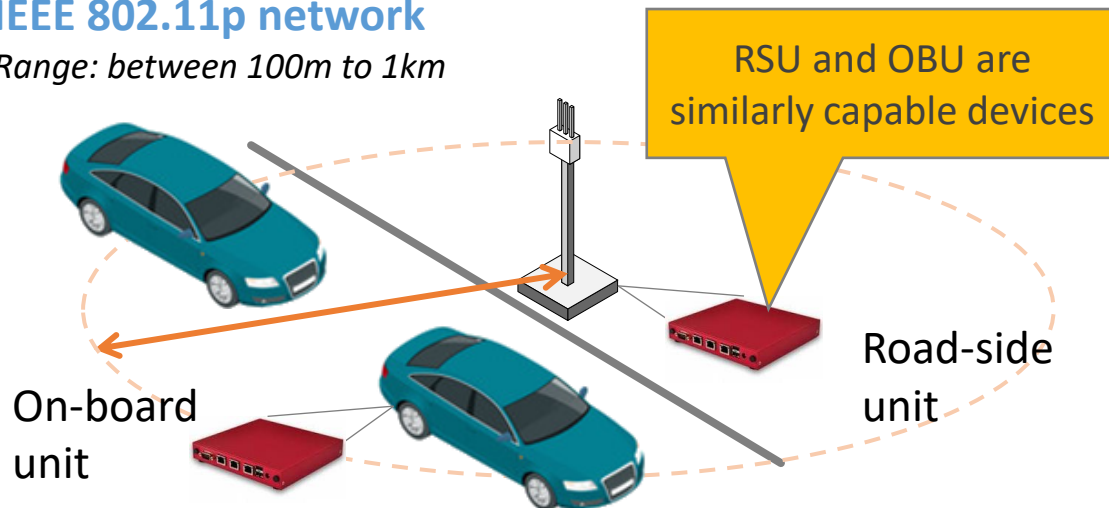
IEEE 802.11n/ac/ax network

Range: between 1m to 300m



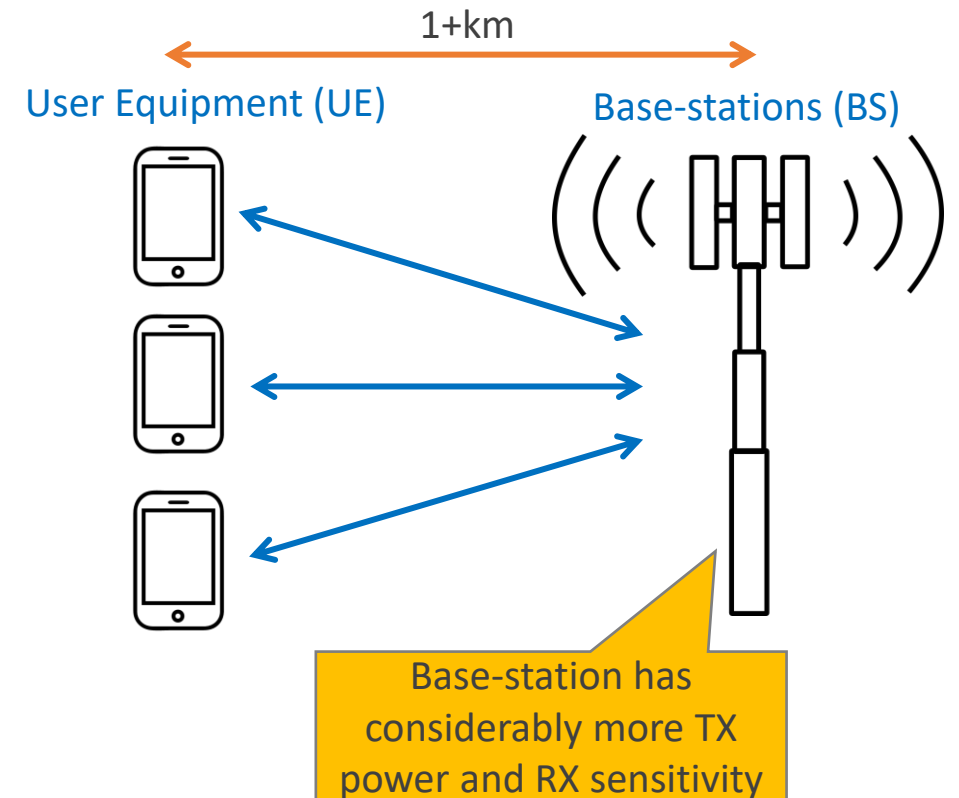
IEEE 802.11p network

Range: between 100m to 1km



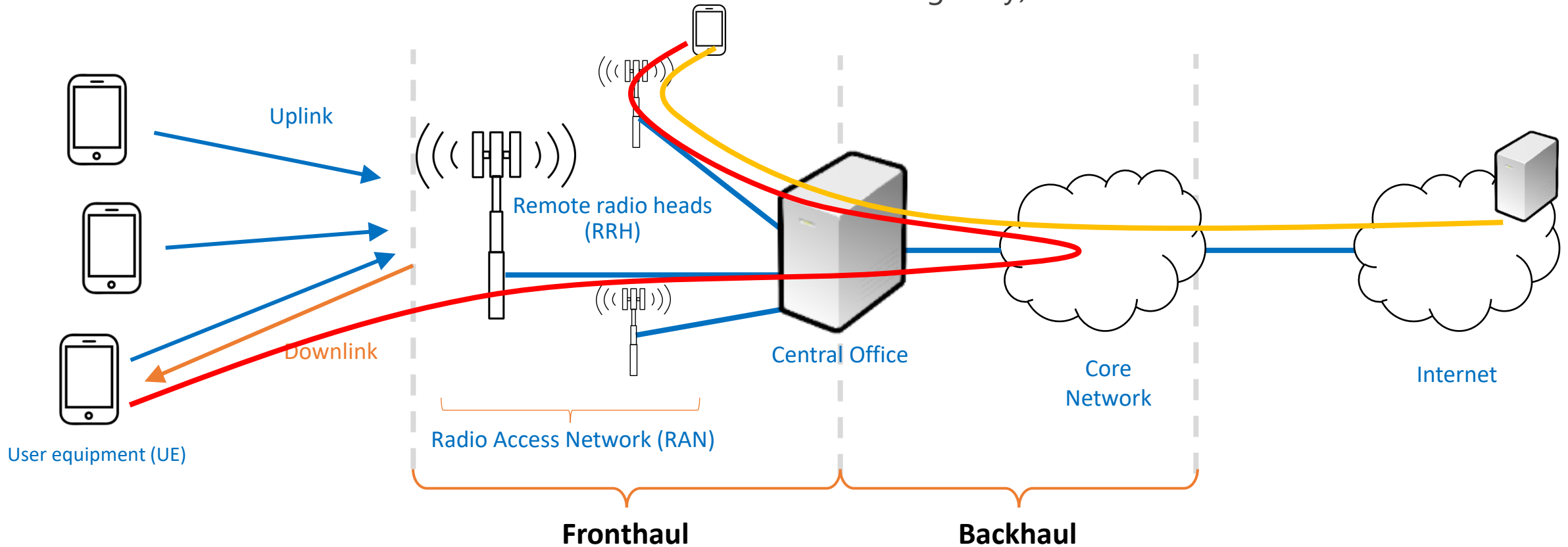
WAN

- **Cellular Technologies:** 2G/GSM, 3G/UMTS, 4G/LTE, 5G/NR, NB-IoT, LoRa, SigFox
- **WiMax** (IEEE 802.16)



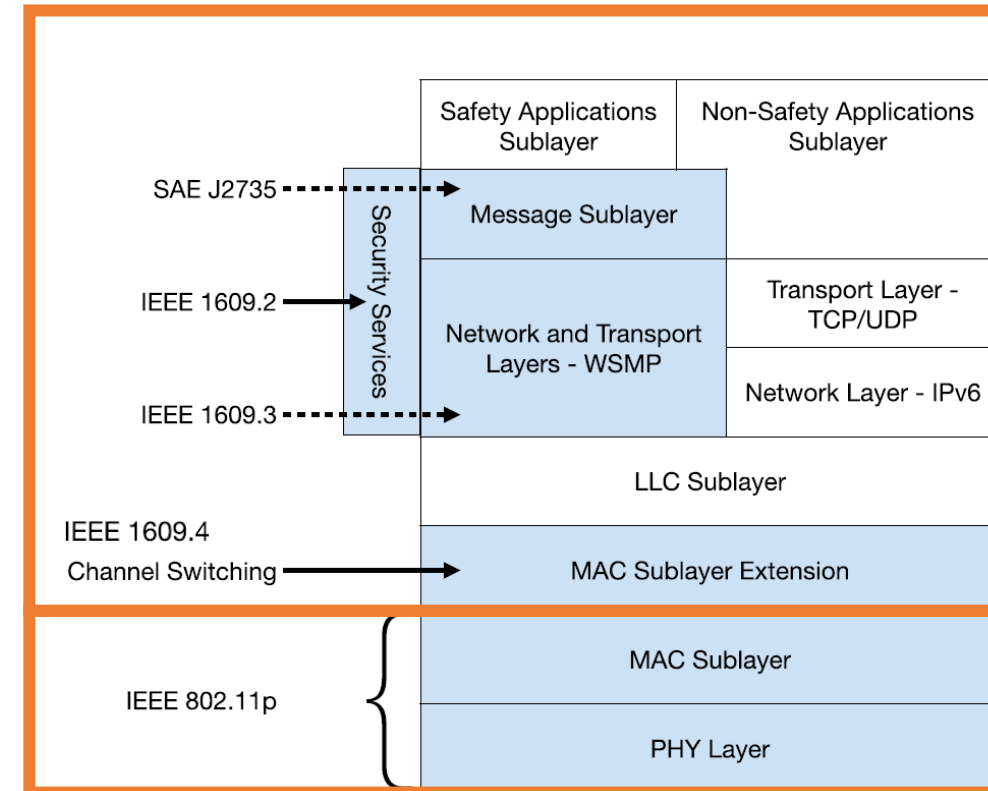
Cellular Architectures and Asymmetric

- The most prominent example of Wide-Area Networks (WAN) are **cellular** networks (and thus sometimes the terms WAN and cellular are used interchangeably)



Open V2X Standards (Symmetric)

- PHY/MAC layer
 - **IEEE 802.11p**: A variant of the IEEE 802.11 wireless for vehicular communications
 - Dedicated Short-Range Communication (DSRC)
- Upper and Service Layers
 - Several service stacks have been developed on top of the PHY/MAC layers specified by IEEE 802.11p
 - An example of such services are beacon messages broadcast periodically to all neighbours
- There are regional variants of the service stacks:
 - **ETSI ITS G5**: A service stack devised at Europe that builds on top of IEEE 802.11p
 - Periodic messages: Cooperative Awareness Messages (CAM)
 - **WAVE Wireless Access in Vehicular Environments (USA)**: U.S. service stack the U.S. that builds on top of 802.11p
 - Periodic messages: Basic Safety Messages (BSM)
 - **ARIB T-101 (Japan)**: Japanese service stack; operates on 700MHz



S. Gao, A. Lim, and D. Bevlly, "An empirical study of DSRC V2V performance in truck platooning scenarios," *Digital Communications and Networks*, vol. 2, no. 4, pp. 233–244, Nov. 2016, doi: [10.1016/j.dcan.2016.10.003](https://doi.org/10.1016/j.dcan.2016.10.003).

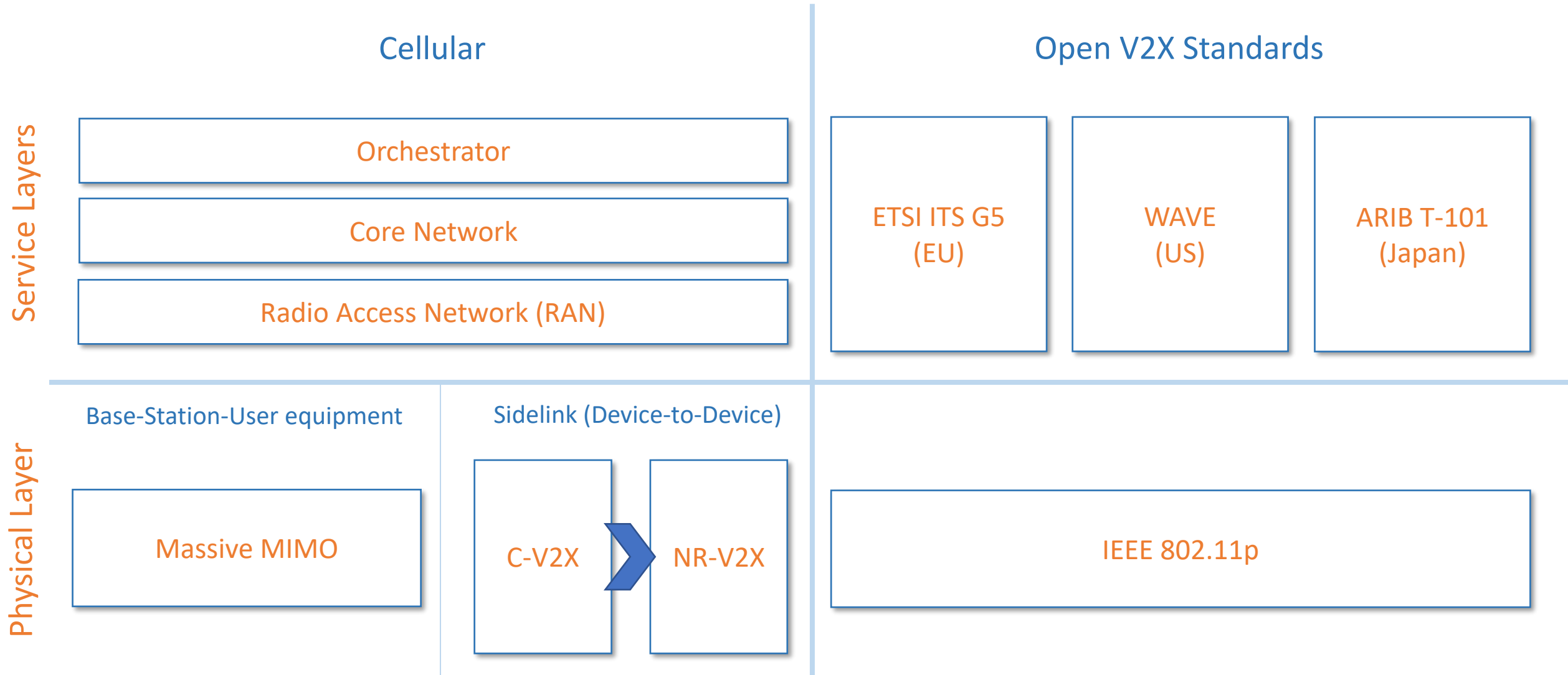
To Read & Discuss

- F. Arena et al., "A Review on IEEE 802.11p for Intelligent Transportation Systems"
- F. Bai et al., "Toward Understanding Characteristics of Dedicated Short Range Communications (DSRC) From a Perspective of Vehicular Network Engineers"
- S. Gao et al., "An-empirical-study-of-DSRC-V2V-performance-in-truck-platooning"

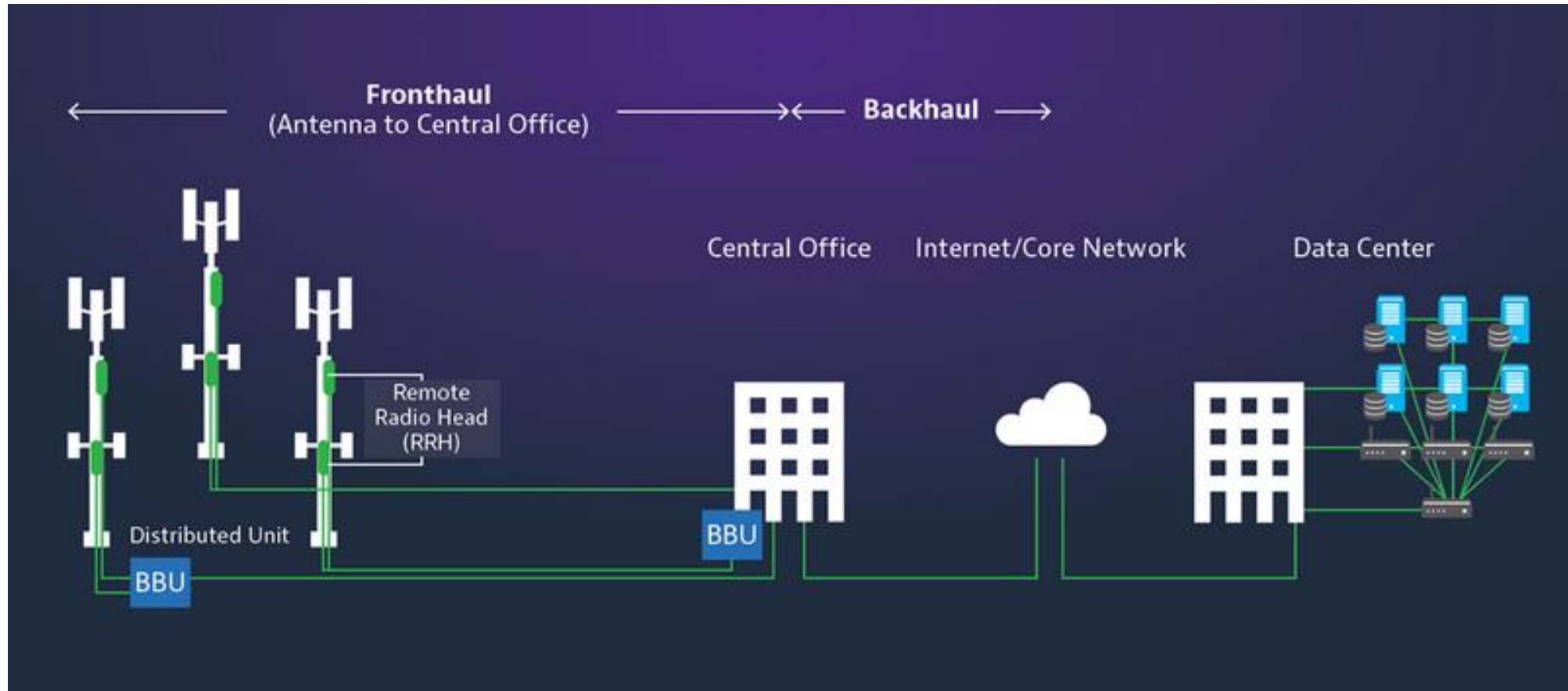
T4. Cellular Technologies Ecosystem

02/05/2021

Technological landscape on vehicular communications



Cellular Architectures



5. Cellular Technologies

- Technology development for cellular systems
 - Driven by 3GPP – a standardization body that includes most OEMs and operators
 - Cellular specifications are formalized in Releases – currently Release 16
- Massive MIMO
 - Emerging technology
- C-V2X / NR-V2X
 - In cellular terminology, a ‘sidelink’ that complements
- Cellular Service Stack

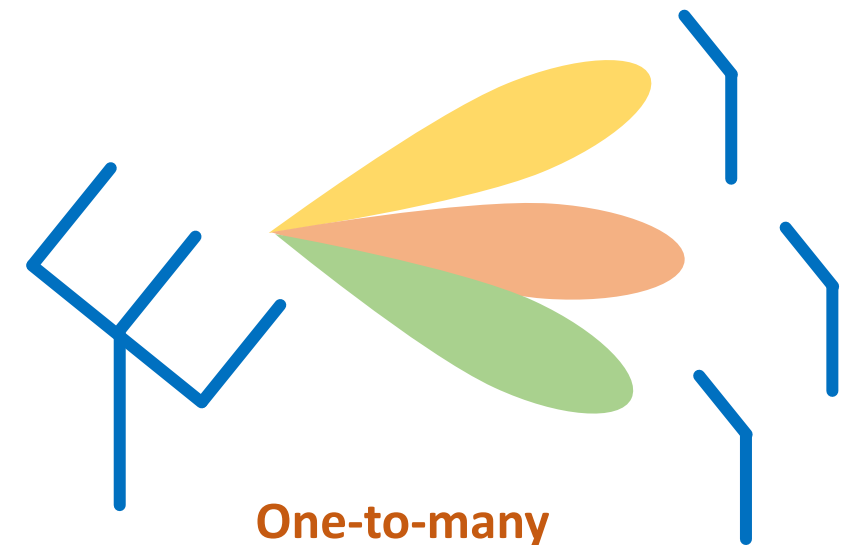


Commercial brand	Name of technical specification	Stand. Body	Time-frame
1G	N/A	N/A	1980
2G	Global System for Mobile Communications (GSM)	ETSI	1990
3G	Universal Media Telecommunications System (UMTS)	3GPP	2000
4G	Long-Term Evolution (LTE)	3GPP	2010
5G	New Radio (NR)	3GPP	2020

MIMO & Massive MIMO

- **Multiple-Input Multiple-Output** is a well-established communication technology, used by both by open LAN standards and cellular specification
- **Parameters in the system**
 - Number of antennas per device – **N**
 - Number of users either RX or TX) – **M**
- **There can be various combinations:**
 - 1 TX with N antennas, 1 RX with N antennas (device-to-device)
 - 1 TX with N antennas, M RX with 1 antenna each (one-to-many)
 - M TX with 1 antennas; 1 RX with N antennas (many-to-one)
 - M TX with N antennas; M RX with N antennas (many-to-many)

A few examples of MIMO application:

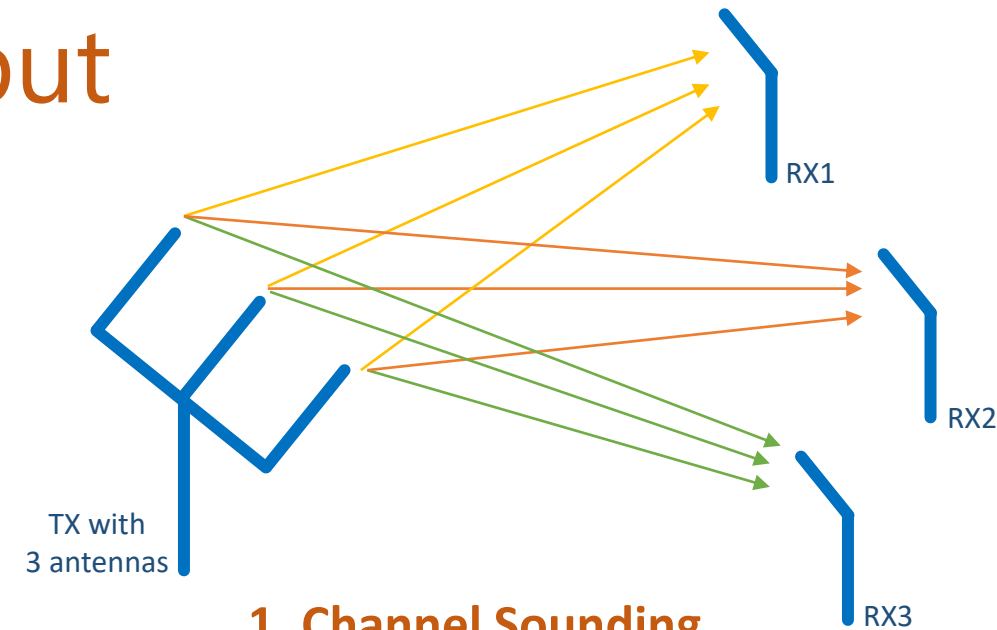


Multiple-Input Multiple Output

- Let's take the situation of 1 TX with 3 antennas, M RX with 1 antenna each (one-to-many)
- Channels between each TX antenna and each one of RX antennas are independent, i.e., it affects the transmitted signal in a different way.
- This leads to a matrix system that can be solved: $\mathbf{y} = \mathbf{H}\mathbf{x}$

$$\begin{array}{c} \text{Signal} \\ \text{Received} \end{array} \begin{bmatrix} Y_{1,3} \\ Y_{2,3} \\ Y_{3,3} \end{bmatrix} = \begin{array}{c} \text{Channel matrix} \\ \begin{bmatrix} H_{1,1} & H_{1,2} & H_{1,3} \\ H_{2,1} & H_{2,2} & H_{2,3} \\ H_{3,1} & H_{3,2} & H_{3,3} \end{bmatrix} \end{array} \begin{array}{c} \text{Signal} \\ \text{Transmitted} \end{array} \begin{bmatrix} X_{1,3} \\ X_{2,3} \\ X_{3,3} \end{bmatrix}$$

- Although counter-intuitive, it is in fact **IMPERATIVE** that the channels are very different! Otherwise, the channel matrix may not be invertible, and then the system is not solvable!
- The TX can learn the channels to each RX through a mechanism named **Channel Sounding**. Knowing the channel matrix, the TX can transmit to all receivers simultaneously. $\mathbf{m} = \mathbf{H}^{(-1)}\mathbf{H}\mathbf{m}$



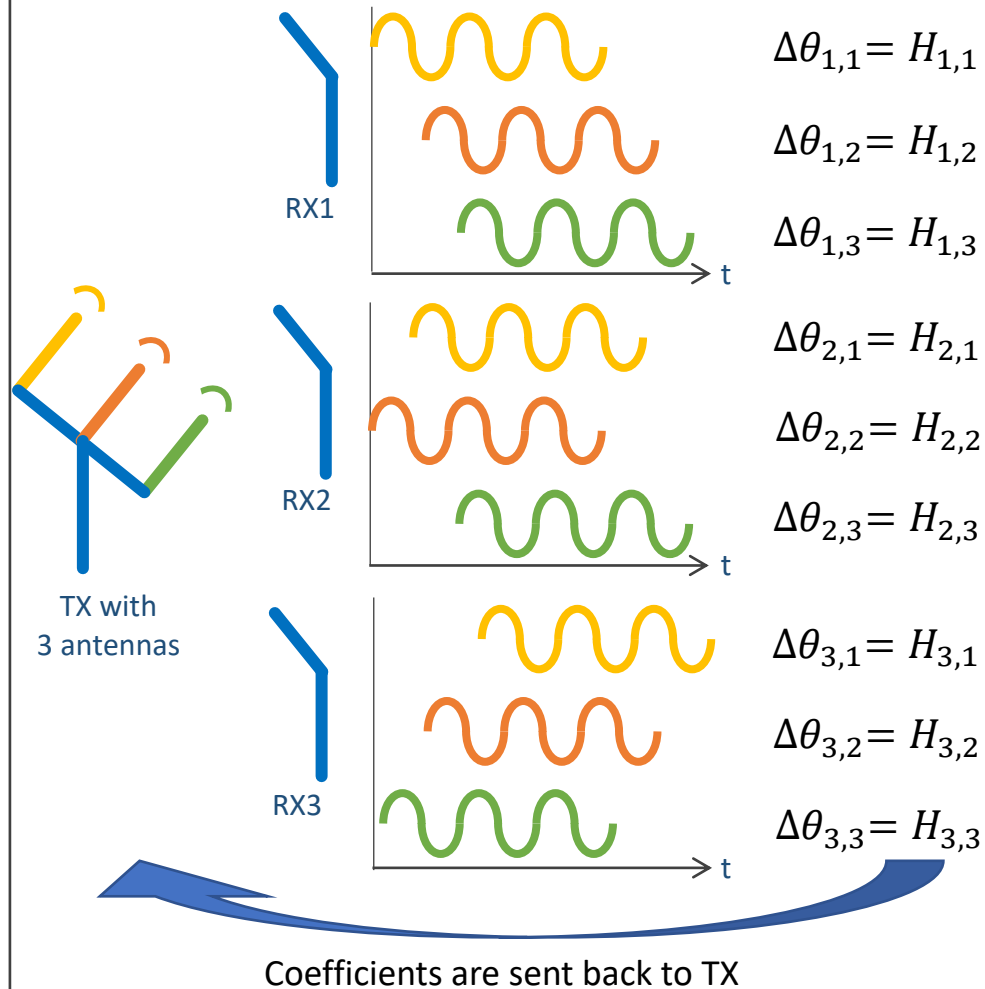
1. Channel Sounding



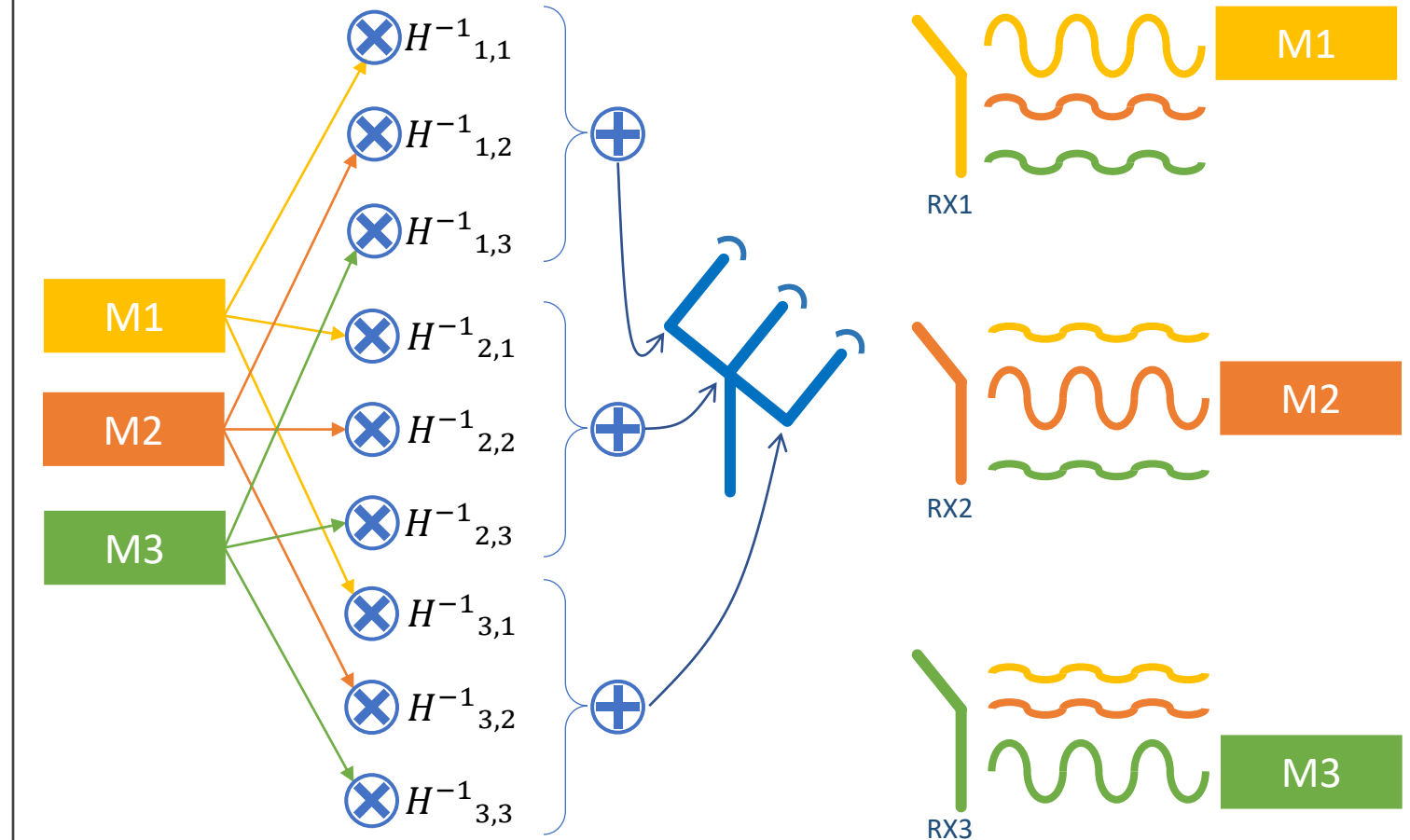
2. Transmission from TX to N RX

MIMO Transmission Example: 1-to-many

1. Channel Sounding

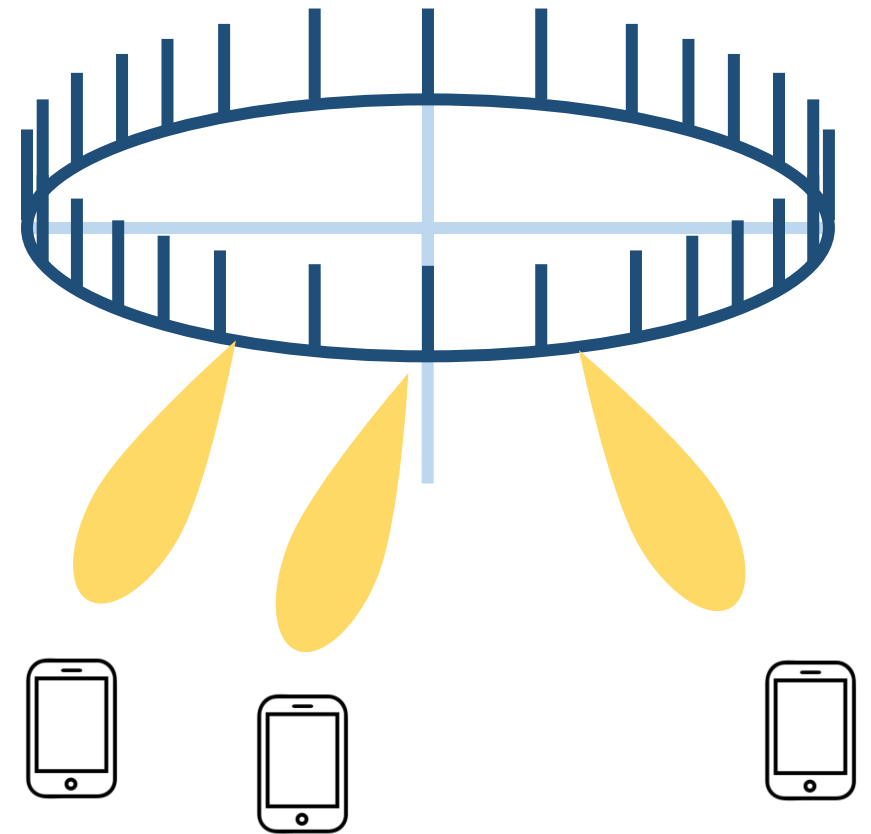


2. Transmission from TX to N RX



Massive MIMO

- Massive MIMO is performing MIMO with a N -antenna TX (base-station) to M users with a single antenna (for simplicity), at a larger scale (e.g., $N > 50$)
- It applies to having the base-station being both TX or RX

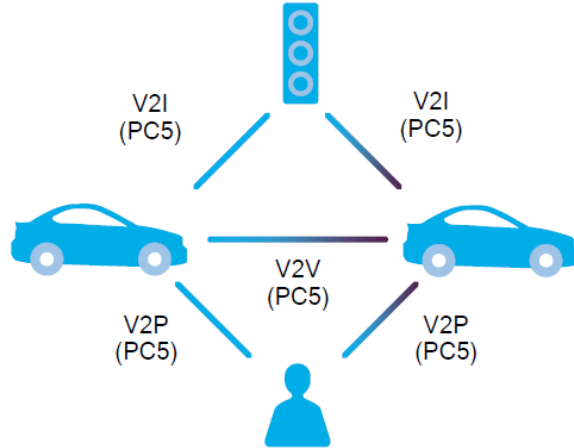


C-V2X

C-V2X has two complementary communication modes

Direct (= Sidelink)

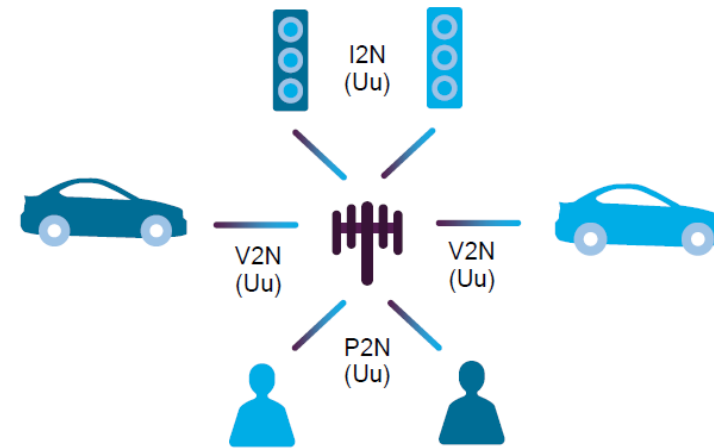
V2V, V2I, and V2P operating in ITS bands (e.g. ITS 5.9 GHz) independent of cellular network



Short range (<1 kilometer), location, speed
Implemented over “PC5 interface”

Network (= Up/Downlink)

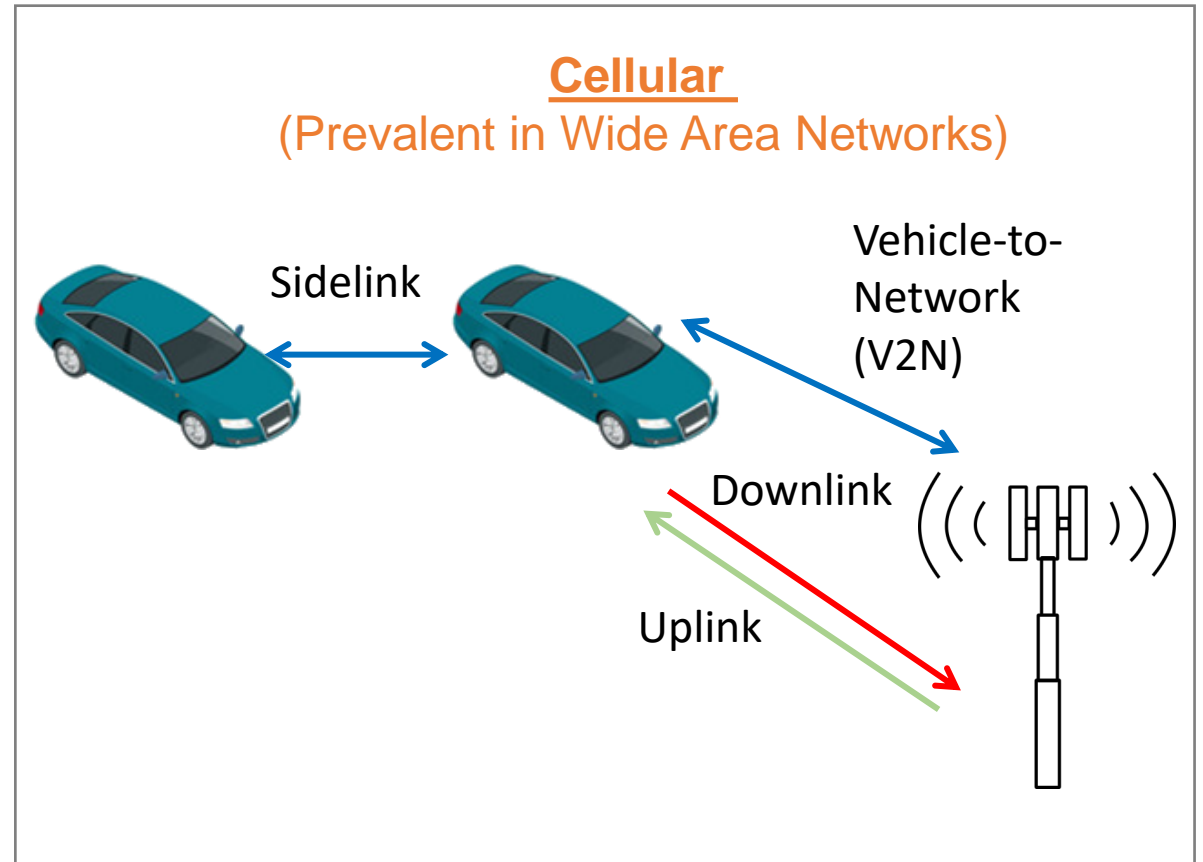
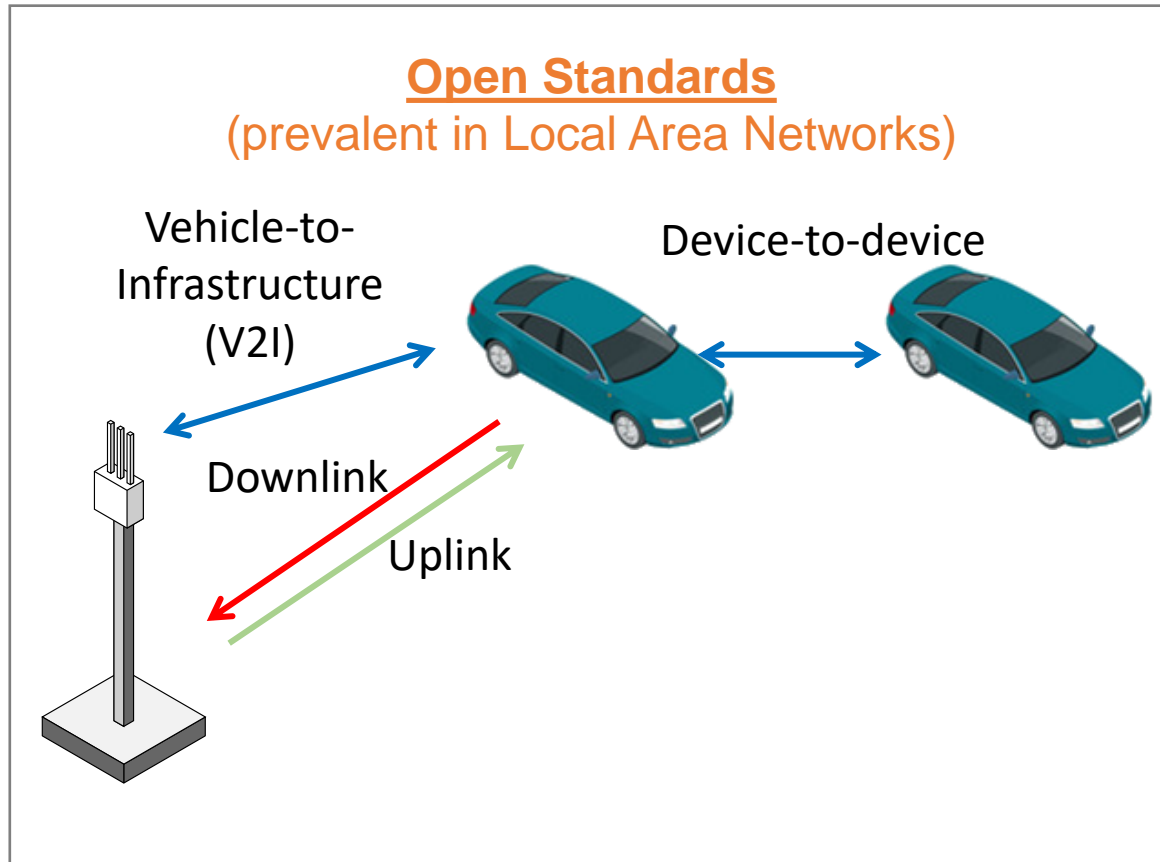
V2N operates in traditional mobile broadband licensed spectrum

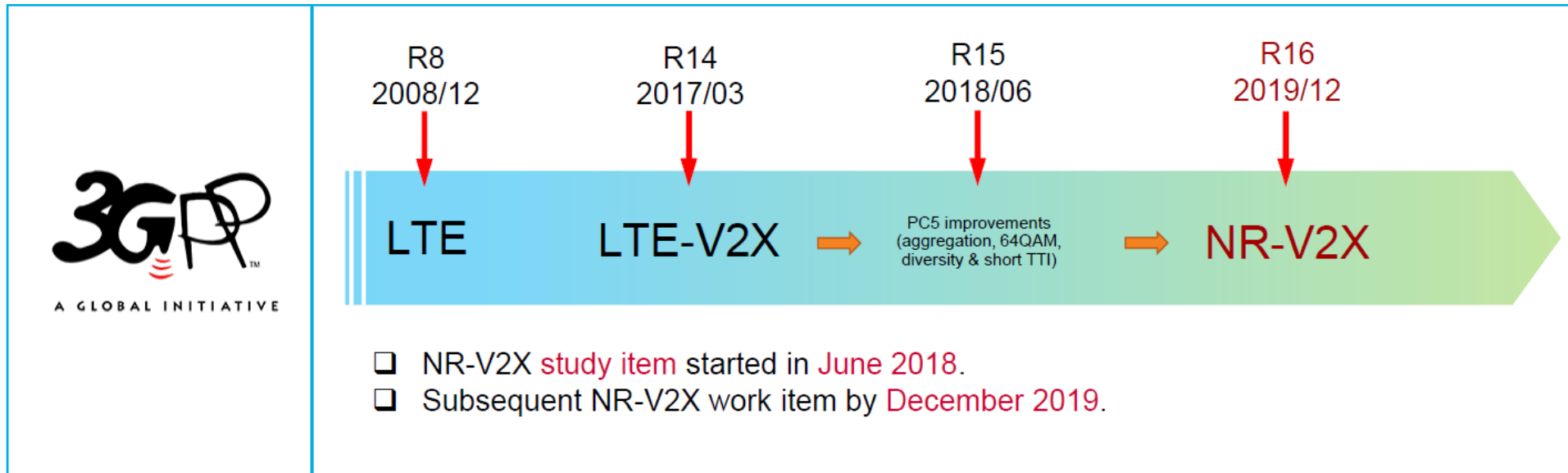


Long range (>1 kilometers). e.g. accident ahead
Implemented over “Uu interface”

Maxime Flament (CTO, 5GAA), “**Path towards 5G for the automotive sector (slides)**”, 17 Oct 2018.

Terminology in Different Contexts

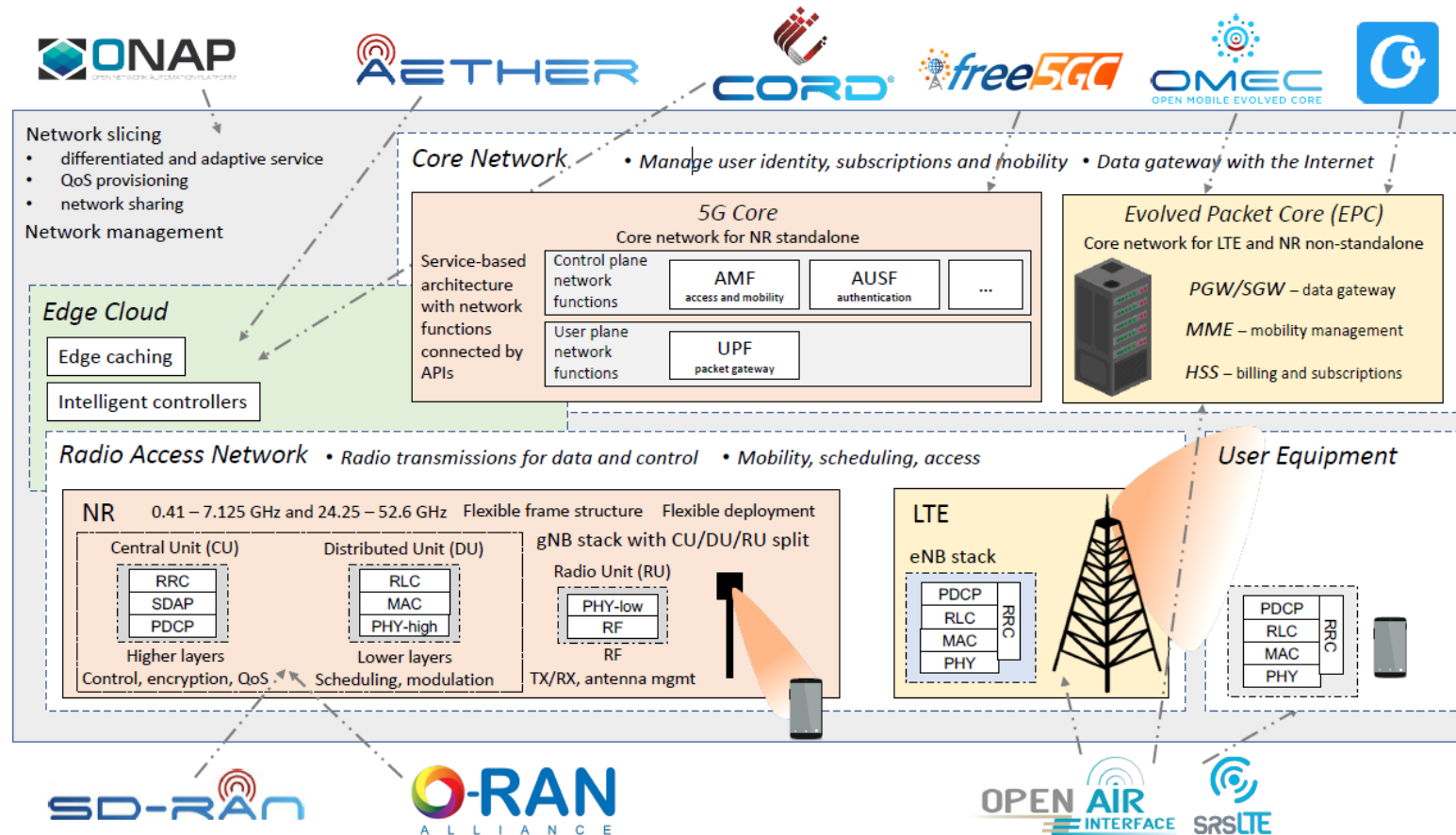




- Maxime Flament (CTO, 5GAA), “Path towards 5G for the automotive sector (slides)”, 17 Oct 2018.

Commercial brand	Name of technical specification	Stand. Body	Time-frame
1G	N/A	N/A	1980
2G	Global System for Mobile Communications (GSM)	ETSI	1990
3G	Universal Media Telecommunications System (UMTS)	3GPP	2000
4G	Long-Term Evolution (LTE)	3GPP	2010
5G	New Radio (NR)	3GPP	2020

Cellular Technological Ecosystem



To Read & Discuss

- E.Larsson et al., "Massive MIMO for Next Generation Wireless Systems"
- T.Marzetta, "Massive MIMO: An Introduction"
- 5GAA, "5GAA-v2x-technology-benchmark-testing-dsrc-and-c-v2x"
- M.Garcia et al., "A Tutorial on 5G NR V2X Communications"
- L.Bonati et al., "Open Programmable and Virtualized 5G Networks State-of-the-Art and the Road Ahead"

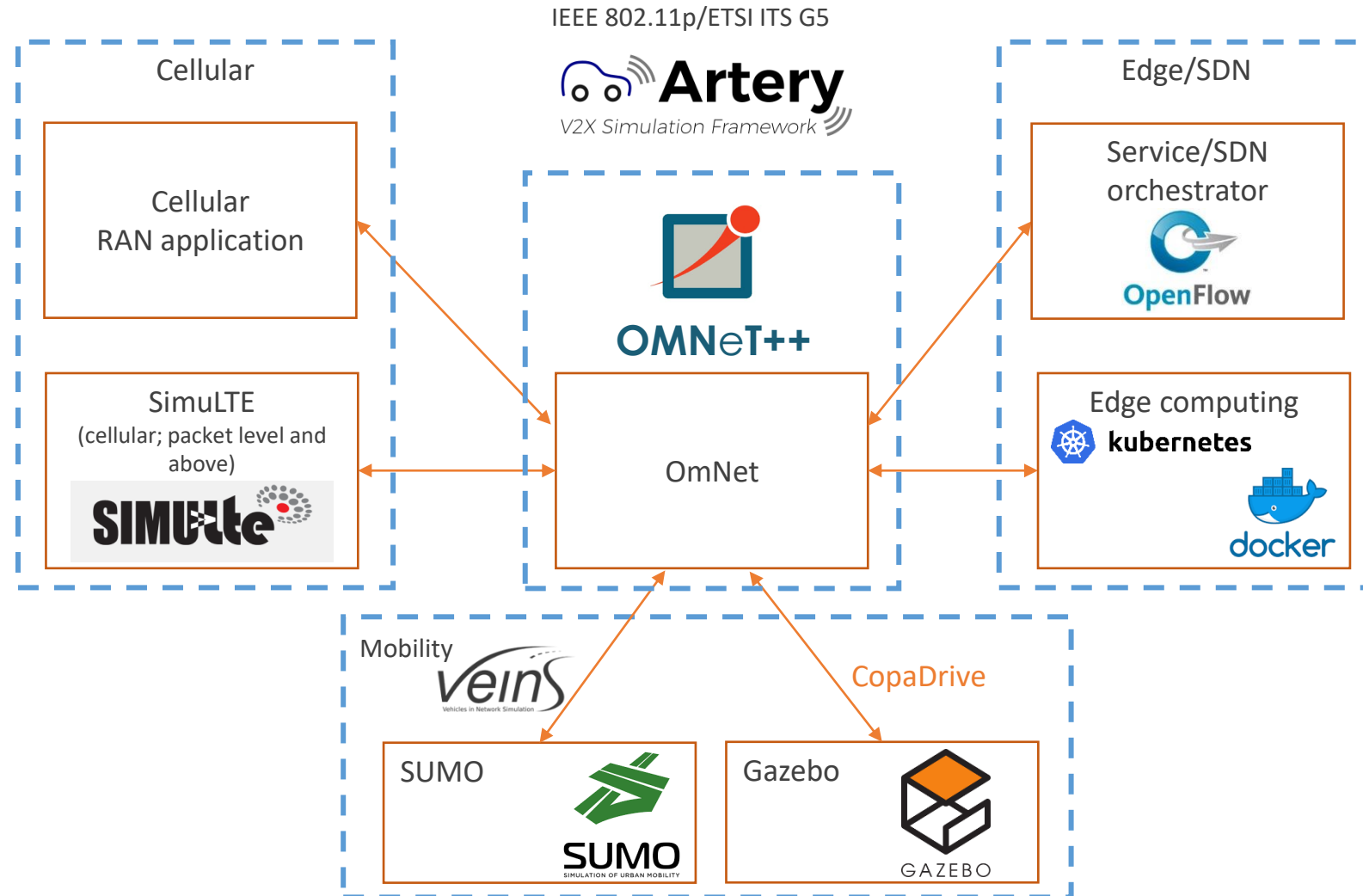
T5. Simulation Tools

31/03/2021

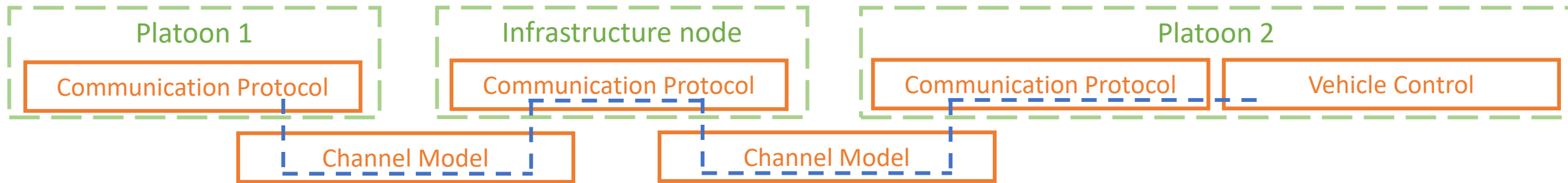
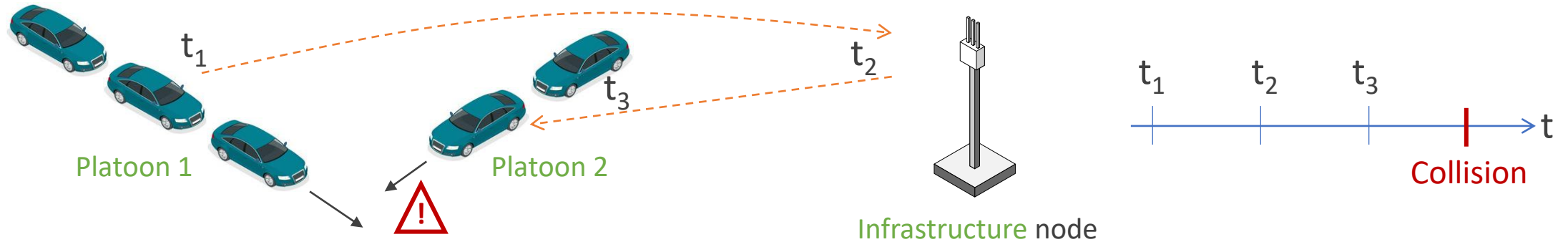
Simulation Tools

- **OmNet**: Discrete Event Simulator; focus on networking when paired with networking libraries (INET)
- **Veins**: VANET framework extension to OmNet++ (<https://veins.car2x.org/>)
- **Artery**: Extension to Veins that provides the ETSI ITS G5 stack
- **SimuLTE**: Extension to Veins and Artery for cellular communications
- **Eclipse SUMO**: Mobility simulator (Macroscopic vehicular mobility)
 - **PLEXE**: A platooning simulator (now integrated with SUMO)
- **Gazebo**: Robotic control simulator (Microscopic vehicular mobility)

Simulation Tools



Simulation Example



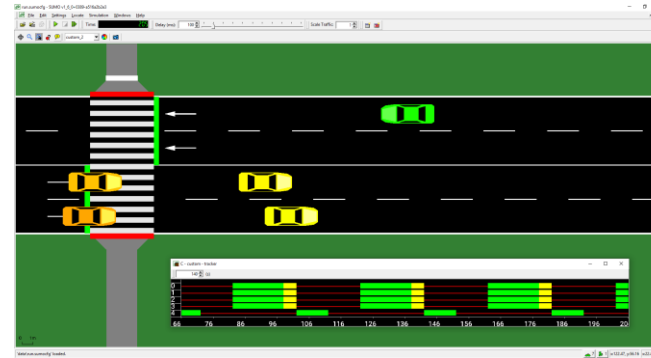
Vehicle Control

Communication Protocol / Channel Model



VEINS & SUMO

- SUMO is a large-scale mobility simulator
 - Contains (simple) mobility models that allow to model hundreds of vehicles.
 - It provides routing of vehicles, car following models, among other things
- Veins is an OMNeT library that links with SUMO
 - Inputs from the OMNeT (network) can affect vehicle mobility in SUMO.
- VEINS and SUMO operate in lockstep.
 - After an update from SUMO, OMNeT carries out the networking exchanges while SUMO waits.
 - Once OMNeT is over, relevant information is sent to SUMO, that will then run.



Lockstep Operation

Vehicle Mobility

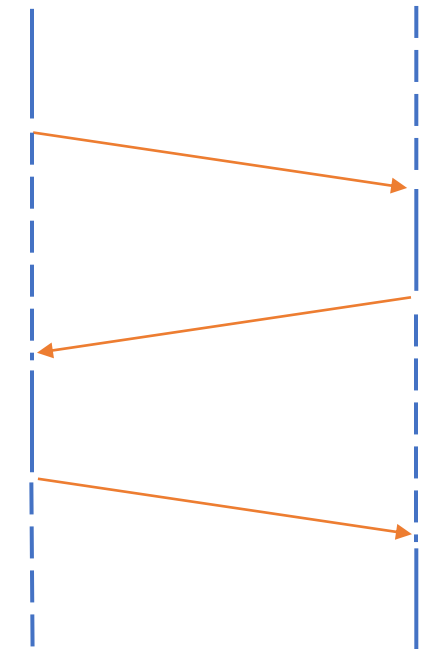
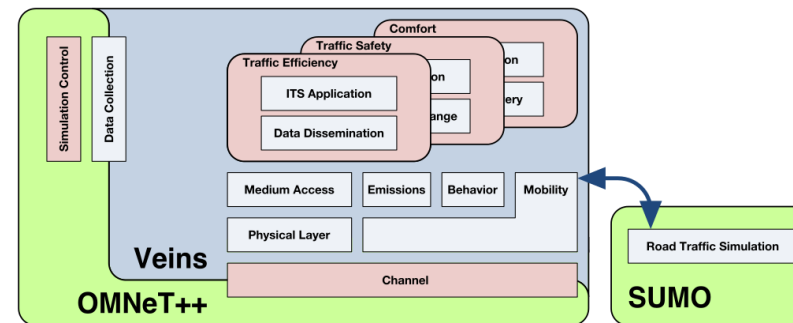
Communication Protocol



SUMO



OMNeT++

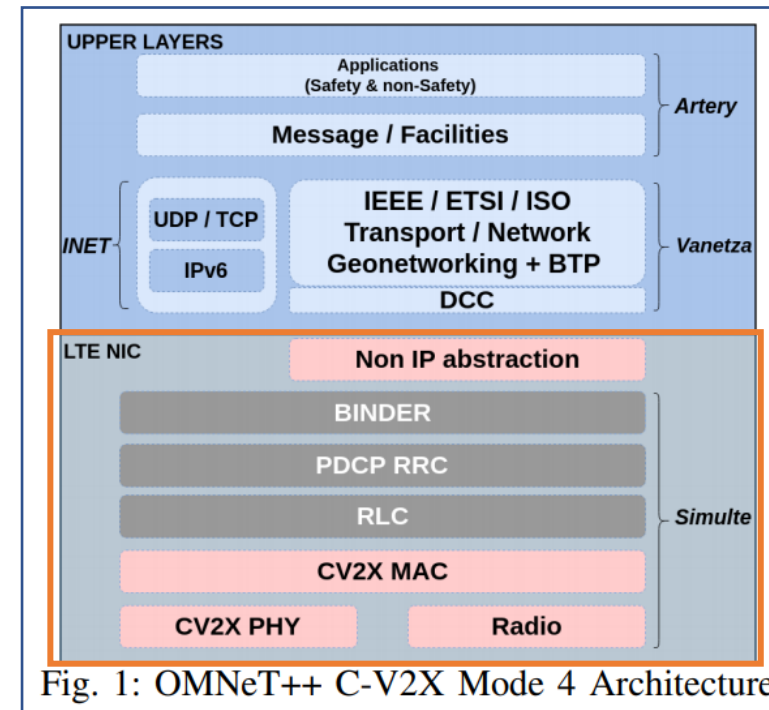
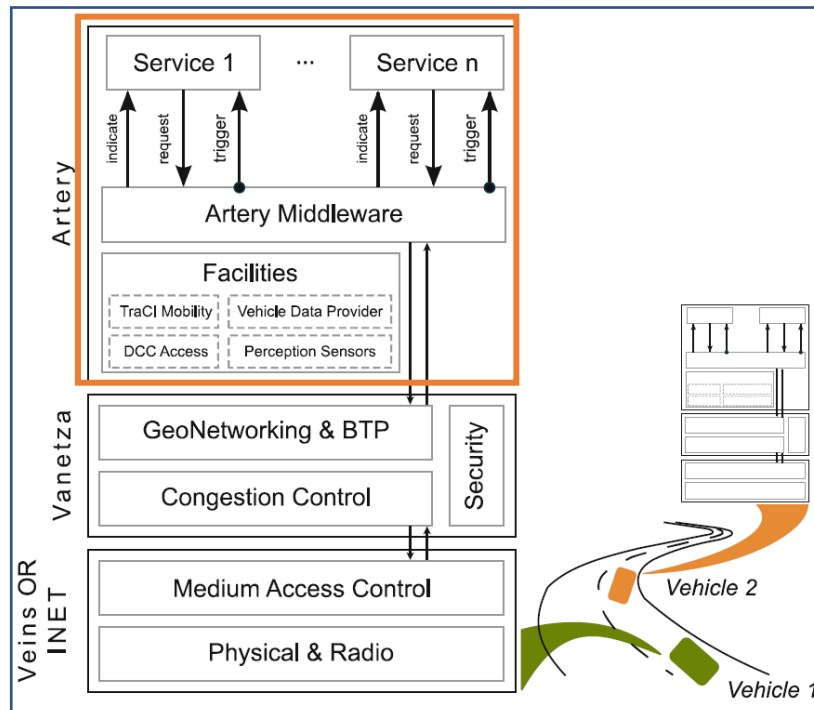


Artery & SimuLTE

- Two relevant additional libraries:
 - Artery provides the ETSI ITS G5 service stack
 - SimuLTE provides the PHY/MAC layers of cellular communications



802.11p



5G

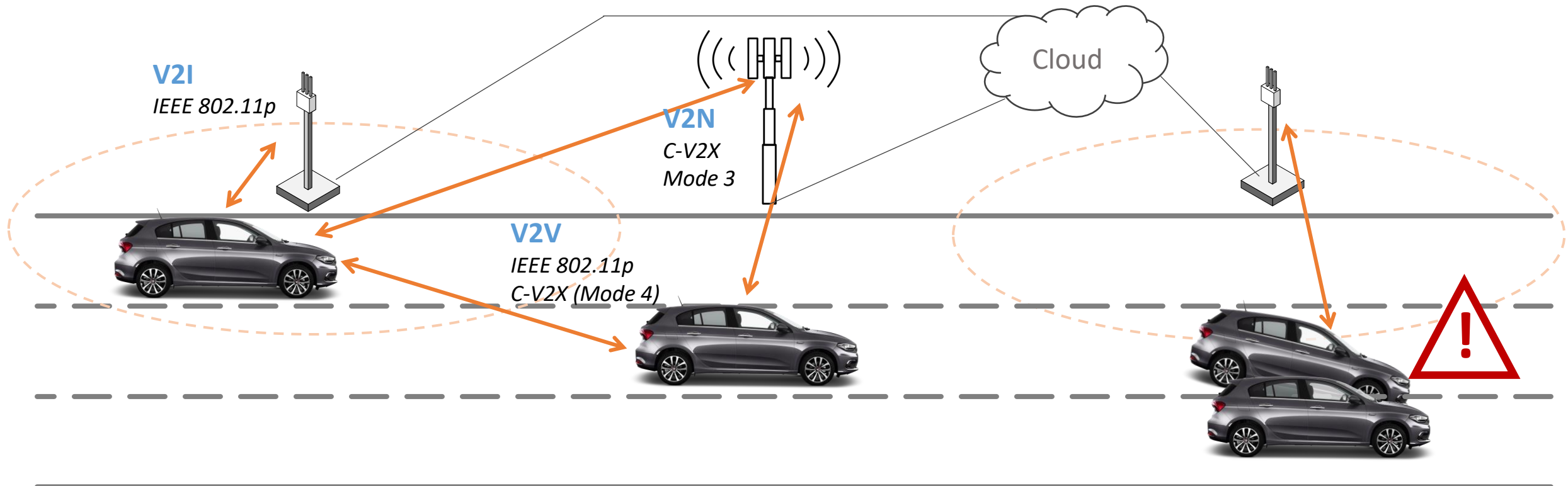
5. To Read & Discuss

- C.Sommer et al., "Bidirectionally Coupled Network and Road Traffic Simulation for Improved IVC Analysis"
- M.Segata et al., "PLEXE A Platooning Extension for Veins"
- R.Riebl et al., "Artery Large Scale Simulation Environment for ITS"
- R.Riebl et al., "Simulating LTE-Enabled Vehicular Communications"

T6. Co-existence & Other IEEE Technologies

Co-existence of 3GPP and IEEE 802.11

- Cellular and IEEE 802.11 technologies can be complementary
 - IEEE 802.11p operates as a local area network, being mostly useful for V2I and V2V low-latency messages
 - Cellular can complement with long-distance V2N links in areas where infrastructure coverage is limited
 - C-V2X can compete with IEEE 802.11p for V2V links, but there is no concept of Road-Side Unit (RSU)



Noteworthy Versions of IEEE 802.11 standard

- Original – 1/2 Mbit/s, CSMA/CA
- **IEEE 802.11a** (1999) – Band: **5Ghz**; rates: up to 54 Mbit/s. Mod: OFDM w/[BPSK, QPSK, 16-QAM, 64QAM]
- **IEEE 802.11b** (1999) – Band: 2.4GHz, rates: up to 11Mbit/s. Mod.: DSSS
- **IEEE 802.11g** (2003) – Same physical layer as 802.11a but now on **2.4GHz band**
- **IEEE 802.11n** (2007) – Band: 2.4 & 5 GHz; rates: up to 600Mbit/s (if both devices support it). Multi-Input Multiple-Output (MIMO), up to 4 spatial streams.
- **IEEE 802.11ac (WiFi 5)** (2013) – Based on 11n. Band: 2.4 & 5 GHz; rates: up to 6.77Gbit/s . Downlink Multi-User (MU)-MIMO, 160 MHz channels (vs. 80MHz), higher modulation 256-QAM (vs. 64-QAM), 8 spatial streams (vs. 4)
- **IEEE 802.11ax (WiFi 6)** (2018) - Based on 11ac. Band: 2.4 & 5 GHz; rates: up to 11Gbit/s. OFDMA, MU-MIMO, on the uplink (as well as downlink), 1024-QAM.
- **IEEE 802.11be (WiFi 7)** – *in the works...*

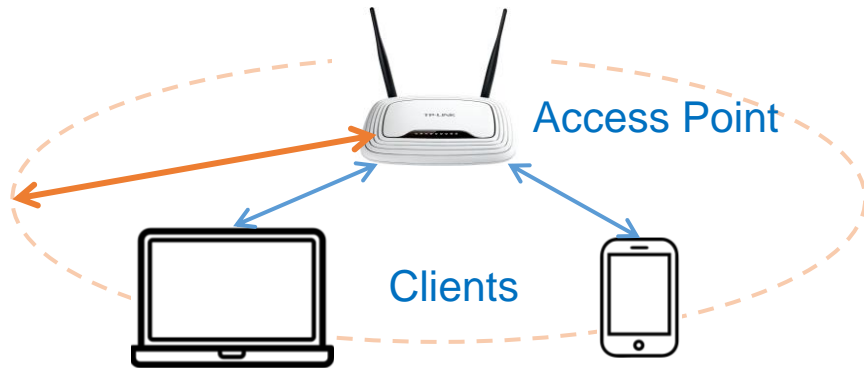
- **IEEE 802.11ad** – 60GHz (mmWave) - WiGig – implements beamforming
- **IEEE 802.11ay** - 60 GHz - Enhancements for ultra High Throughput in and around the 60 GHz Band

Technologies of LAN and WAN

LAN

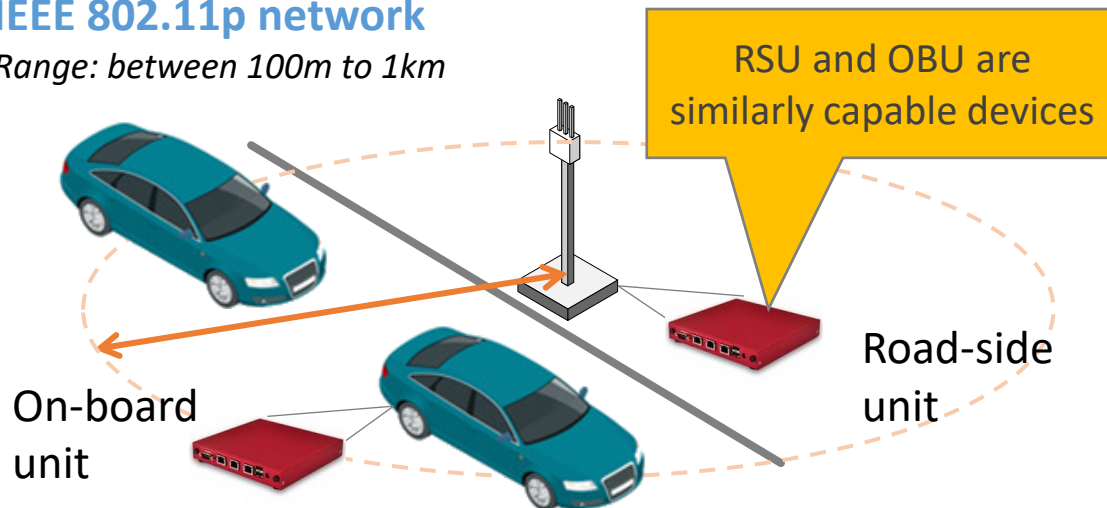
IEEE 802.11n/ac/ax network

Range: between 1m to 300m



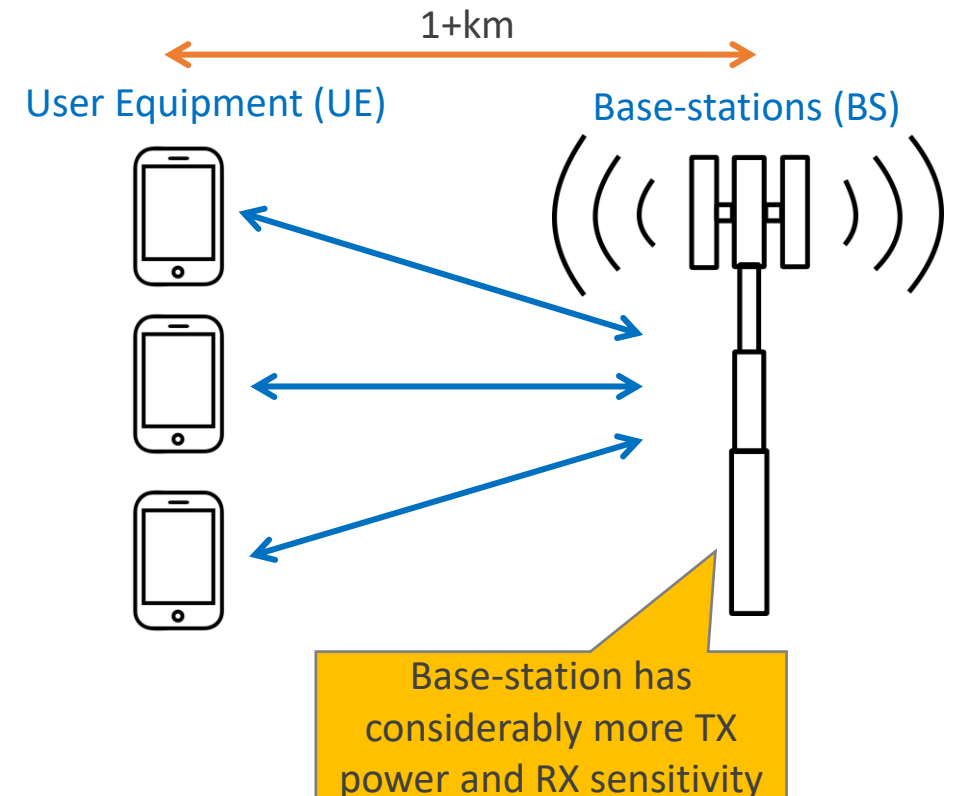
IEEE 802.11p network

Range: between 100m to 1km



WAN

- **Cellular Technologies:** 2G/GSM, 3G/UMTS, 4G/LTE, 5G/NR, NB-IoT, LoRa, SigFox
- **WiMax** (IEEE 802.16)



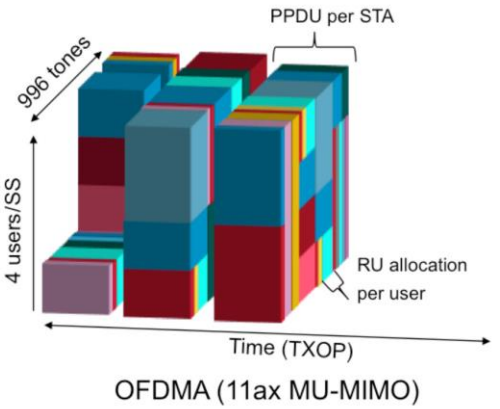
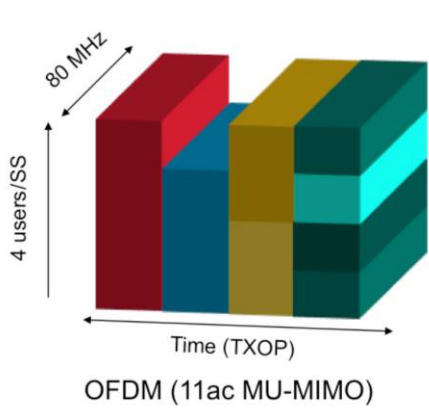
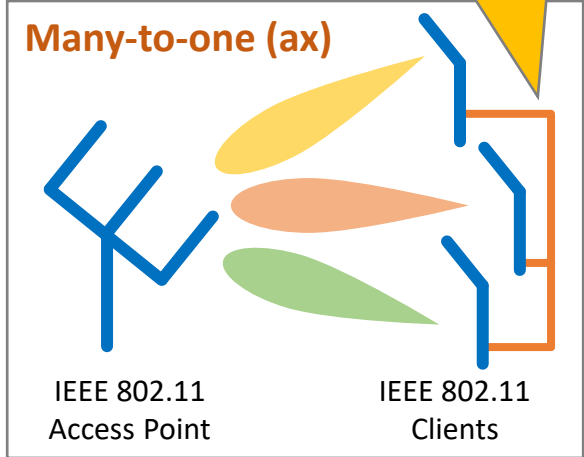
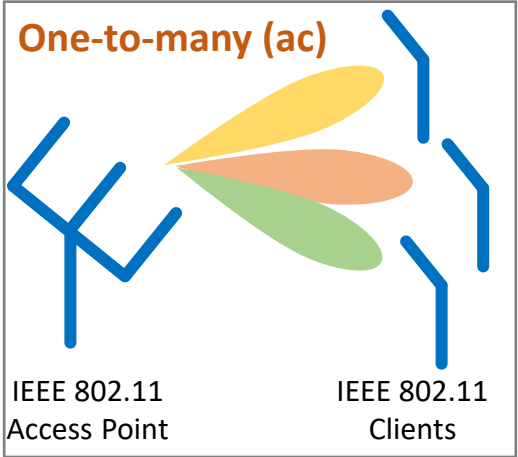
IEEE 802.11ad and 11ax

- IEEE 802.11ad
 - Beamforming at millimeter wavelengths (mmWave) – 60GHz –, requiring highly directional (narrow) beams
- IEEE 802.11ax
 - IEEE 802.11ac supported MU-MIMO in the *Downlink* – from IEEE 802.11 AP to clients – **one-to-many**
 - The *Uplink* – **many-to-one** – is more challenging because all client devices need to be **synchronized!**
 - IEEE 802.11ax defines a new period of **synchronized transmissions triggered by specific AP packets**
 - This is a ground-breaking change: so far IEEE 802.11 always relied on probabilistic medium access.

OFDMA is also used in cellular specification. This show that the same wireless technologies end up finding use in both cellular and WLAN standards



How to synchronize multiple wireless clients?



To Read & Discuss

- “3GPP C-V2X and IEEE 802.11p for Vehicle-to-Vehicle communications in highway platooning scenarios”
- “A Tutorial on IEEE 802.11ax High Efficiency WLANs”
- “Exploratory Study of 802.11ad Vehicular Links”