

# Towards 6G: Opportunities and Challenges of future Multi-Dimensional Networking Solutions

**Christian Wietfeld**  
**christian.wietfeld@tu-dortmund.de**

10 May 2023  
VDE ITG Mobilkommunikation 2023



Faculty of Electrical Engineering and Information Technology  
Communication Networks Institute  
Prof. Dr.-Ing. Christian Wietfeld

# CNI in a nutshell: Reliable Connectivity for Cyber-Physical Systems in Harsh Environments

**Core team of 15+ scientists  
plus numerous students**



**Research Focus  
5G/6G for  
Mission-Critical Services**

**Integrated  
Communication & Sensing**

**Resource-Efficient  
Communications Leveraging  
Machine Learning**



## Extensive Lab Equipment

**Multi-Radio Technology Lab**  
5G NR (incl. mmWave), cloT, Wi-Fi6, LPWAN,  
Software-Defined Radio based Open Source  
O-RAN & 6G solutions, Network/Channel Emulation

## Networked Robotics Lab



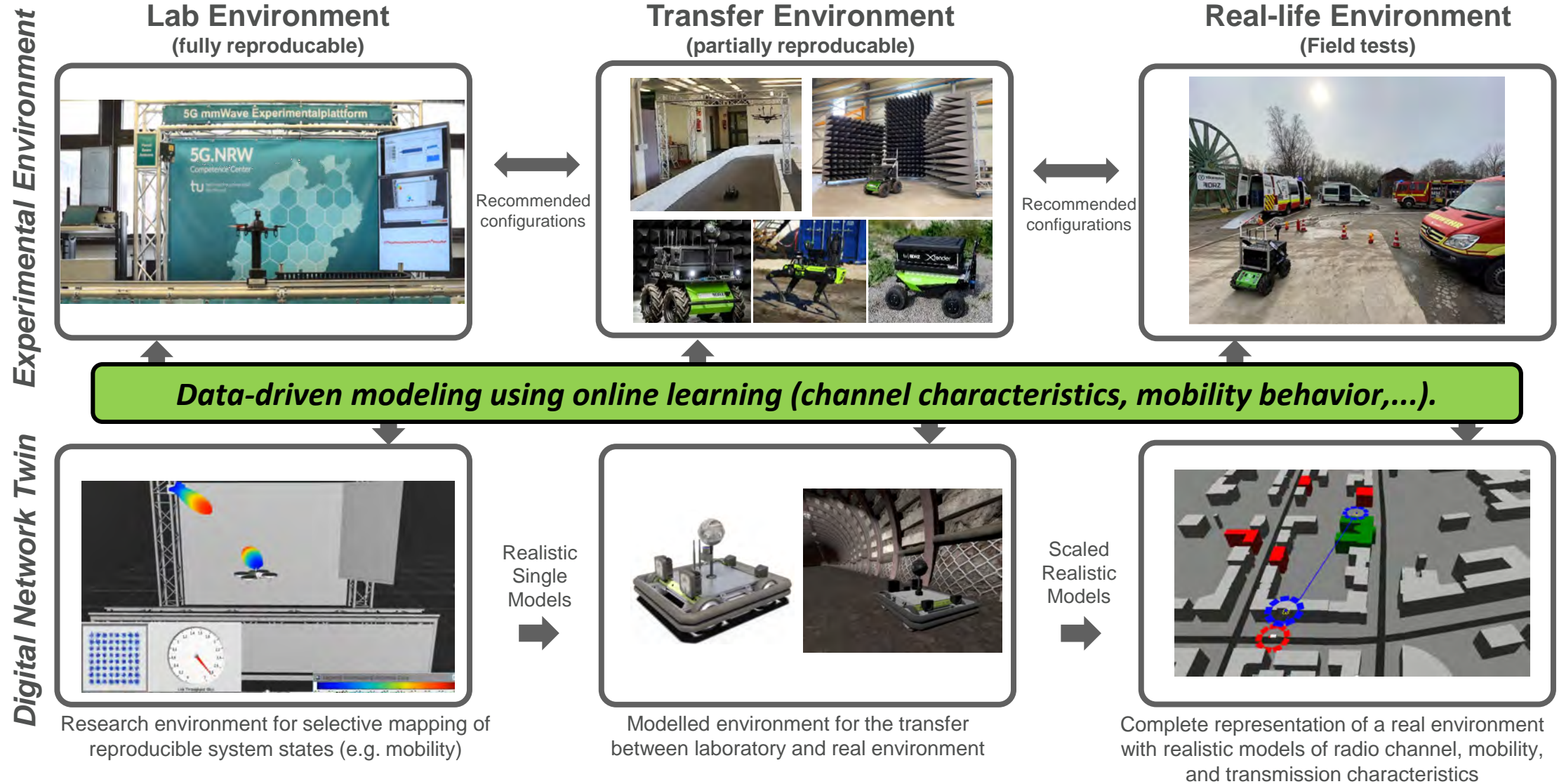
**Successful in field operation and  
testing using Mobile Radio Lab**



## Lead Projects



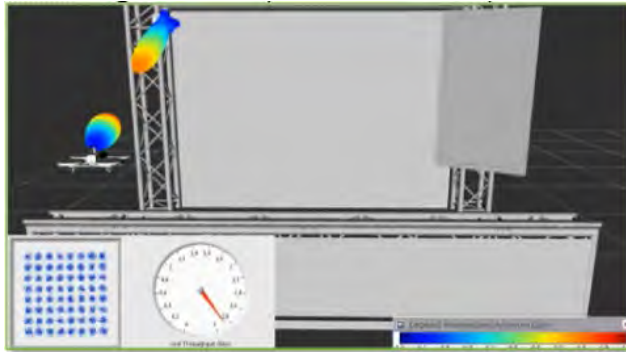
# Research process: interplay between lab, transfer and real-life environments



# Research process: interplay between lab, transfer and real-life environments

*Example: anticipate mobility to allow for mmWave beam and RIS selection and steering*

mmWave Digital Twin (focussed on lab)



mmWave lab environment



Simulation environment (larger scale realistically modelled scenario)



Based on:

- Light-weight ICT-centric Mobility Simulation **LimoSIM**
- **Lean 3D channel model** derived from experiments

B. Sliwa, M. Patchou, K. Heimann, C. Wietfeld, "[Simulating hybrid aerial- and ground-based vehicular networks with ns-3 and LimoSim](#)," In *Proceedings of the 2020 Workshop on Ns-3*, Gaithersburg, Maryland, USA, June 2020. [[bibtext](#)] [[arxiv](#)] [[pdf](#)] [[video](#)].

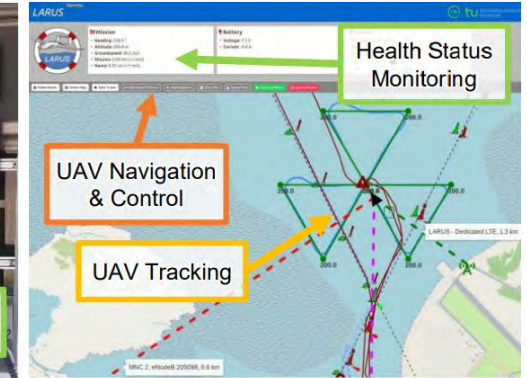
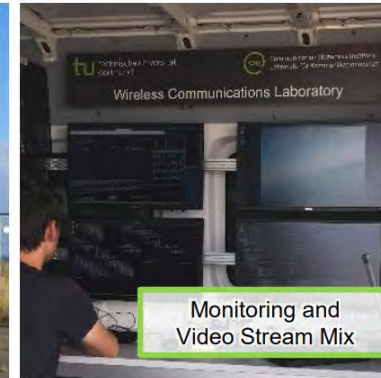
K. Heimann, A. Marsch, B. Sliwa, C. Wietfeld, "[Reflecting Surfaces for Beyond Line-Of-Sight Coverage in Millimeter Wave Vehicular Networks](#)." In *IEEE Vehicular Networking Conference (VNC)*, December 2020. [[bibtext](#)] [[pdf](#)] [[video](#)].

K. Heimann, J. Tiemann, D. Yolchyan, C. Wietfeld, "[Experimental 5G mmWave Beam Tracking Testbed for Evaluation of Vehicular Communications](#)," In *IEEE 2nd 5G World Forum (5GWF) (WF-5G'19)*, September 2019. [[bibtext](#)] [[pdf](#)] [[video](#)].

# Field trial highlight: Multi-Link Networking for SAR drone at Baltic Sea

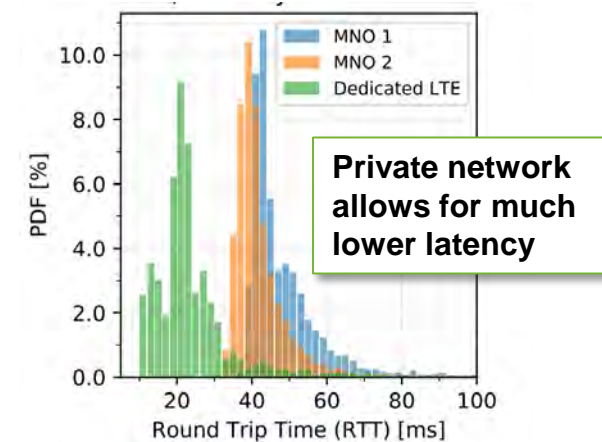
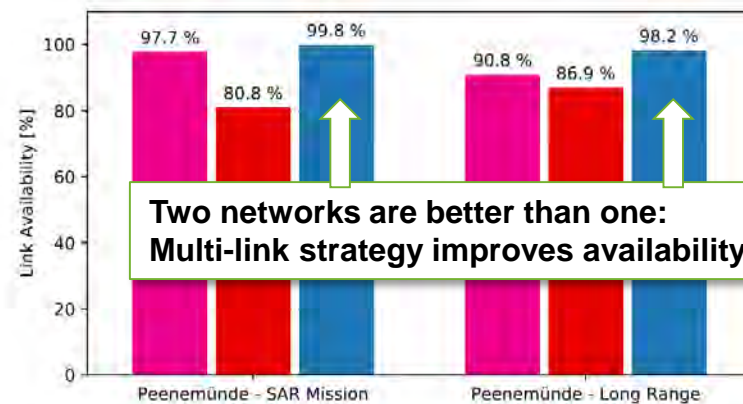
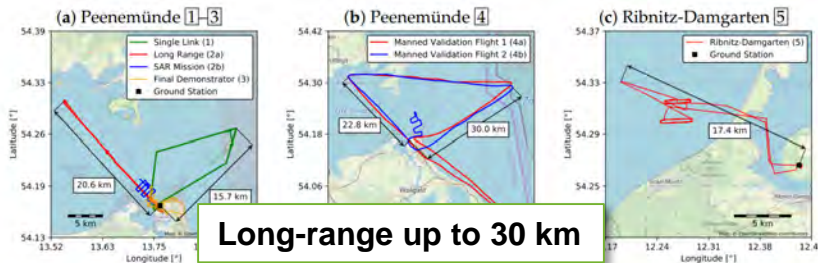
October 2019 search and rescue exercise @ Baltic sea

Mobile wireless lab with dedicated, private network (SDR-based)



Example results

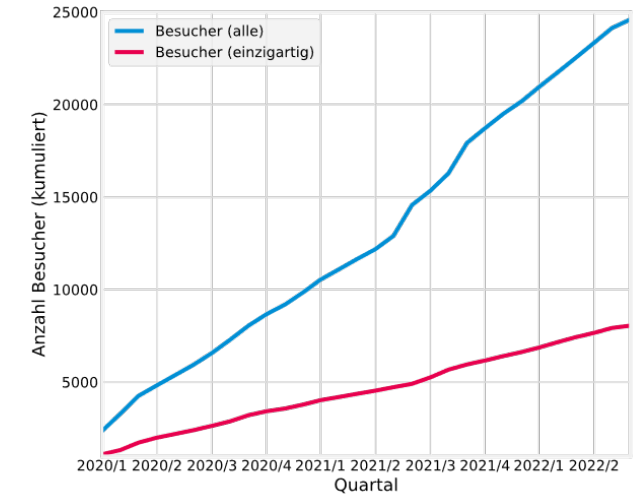
Gathering data in large scale experiments



J. Gldenring, P. Gorczak, F. Eckermann, M. Patchou, J. Tiemann, F. Kurtz, C. Wietfeld, "Reliable Long-Range Multi-Link Communication for Unmanned Search and Rescue Aircraft Systems in Beyond Visual Line of Sight Operation", In Drones, MDPI, vol. 4, no. 2, May 2020.

# Transfer highlight: The Free Online Campus Network Planer

## Lowering entry barrier by supporting the licensing process for private 5G networks

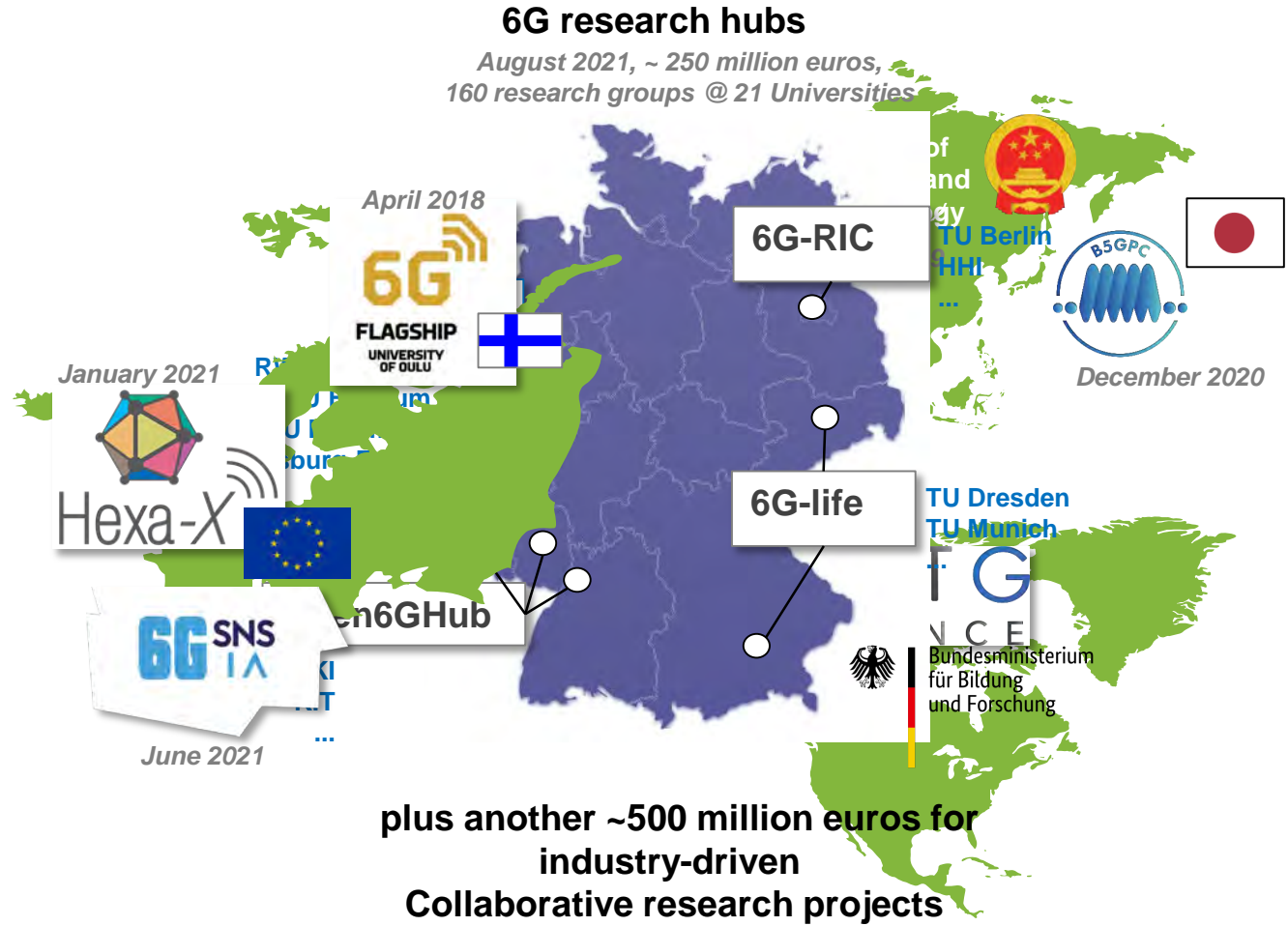


Overall visits	24606
Unique visits	8140

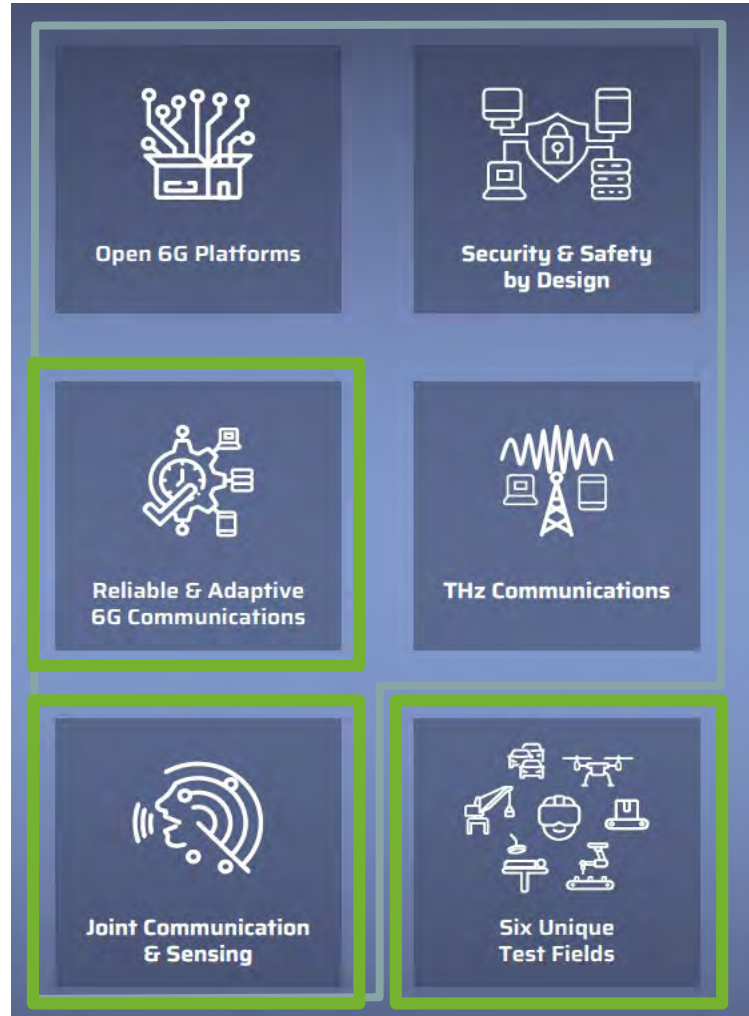
➔ **Currently being evolved towards AI-enabled network planning tool for temporary 5G networks**



# The mobile communications community is moving towards 6G ... and since 2021 at the latest, Germany has been a hotspot for 6G development



# BMBF 6G Research Hub 6GEM in a nutshell



Five research areas

Six test fields

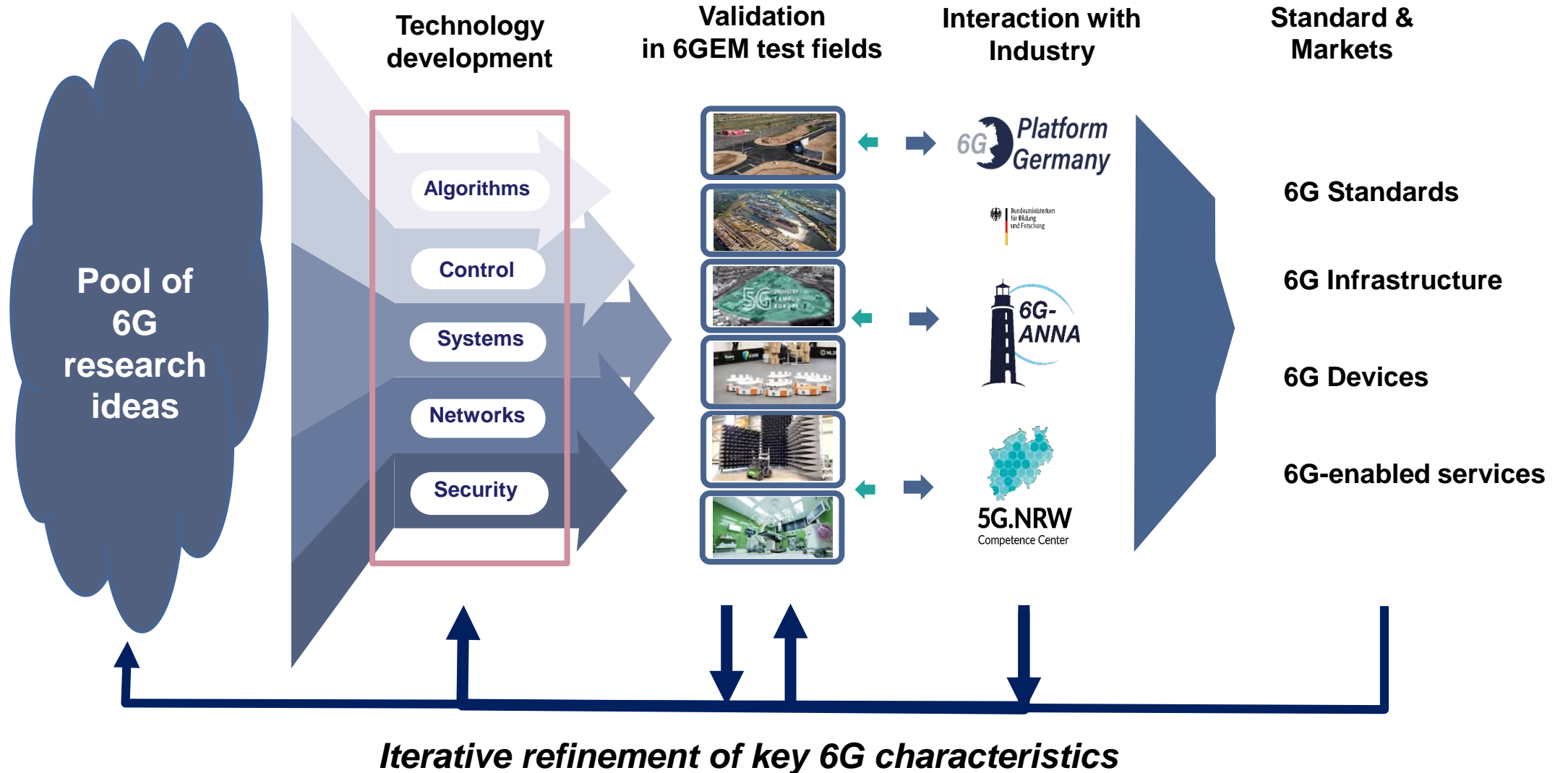
39 PIs



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 Federal Ministry of Education and Research



# An agile 6G innovation cycle: Validation in testfields at an early stage



# Realistic validation of „running code“ in specialized test fields

## 6GEM test fields



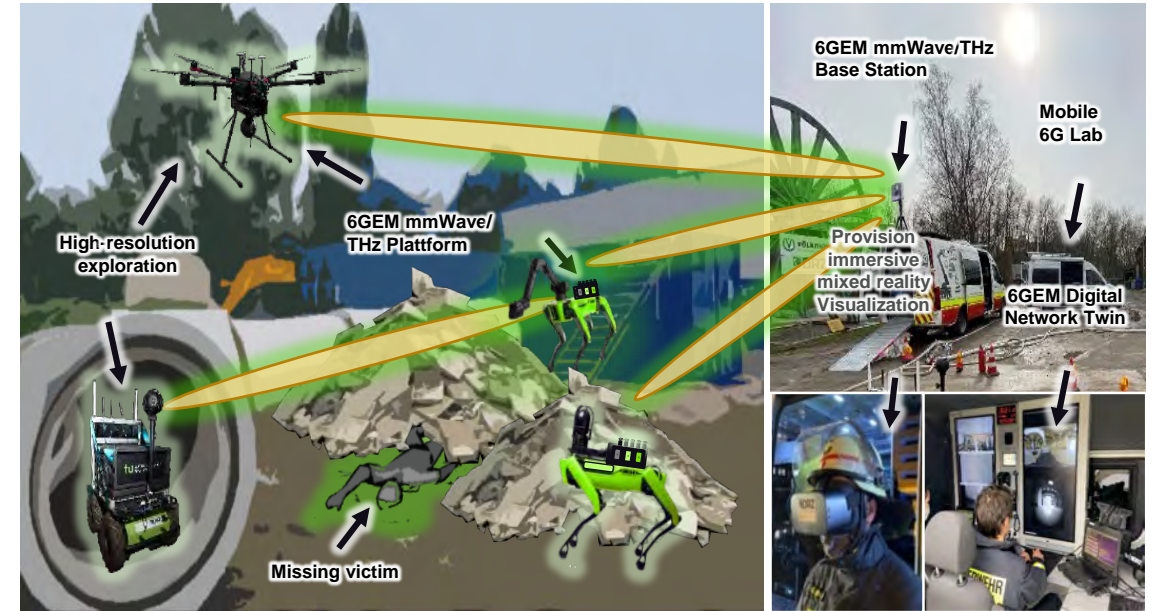
# Example 6G Validation in test fields – Interacting with future users

## Implementing 6G technologies for Rescue Robotics

Unique living lab for rescue robotics



Reliable 6G support and immersive situation awareness



Involvement of first responders

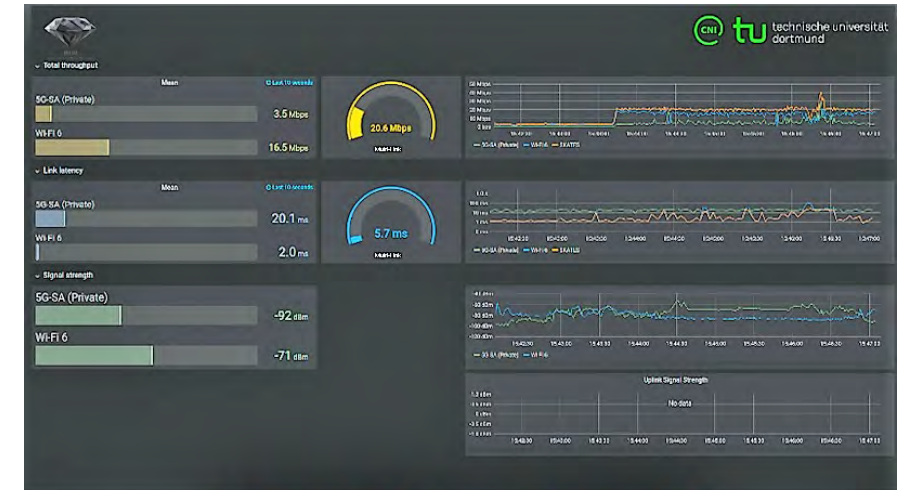


- April 25/26 2023 in Dortmund with 10 international teams
- New communications challenge introduced by TU Dortmund
- Transfer to international Robocup 2023, July 2023, Bordeaux, France

M. Patchou, J. Tiemann, C. Arendt, S. Böcker, C. Wietfeld, "Realtime Wireless Network Emulation for Evaluation of Teleoperated Mobile Robots", In 2022 IEEE International Conference on Safety, Security, and Rescue Robotics (SSRR), Sevilla, Spain, November 2022.

# Example Test Field: Rescue Robotics

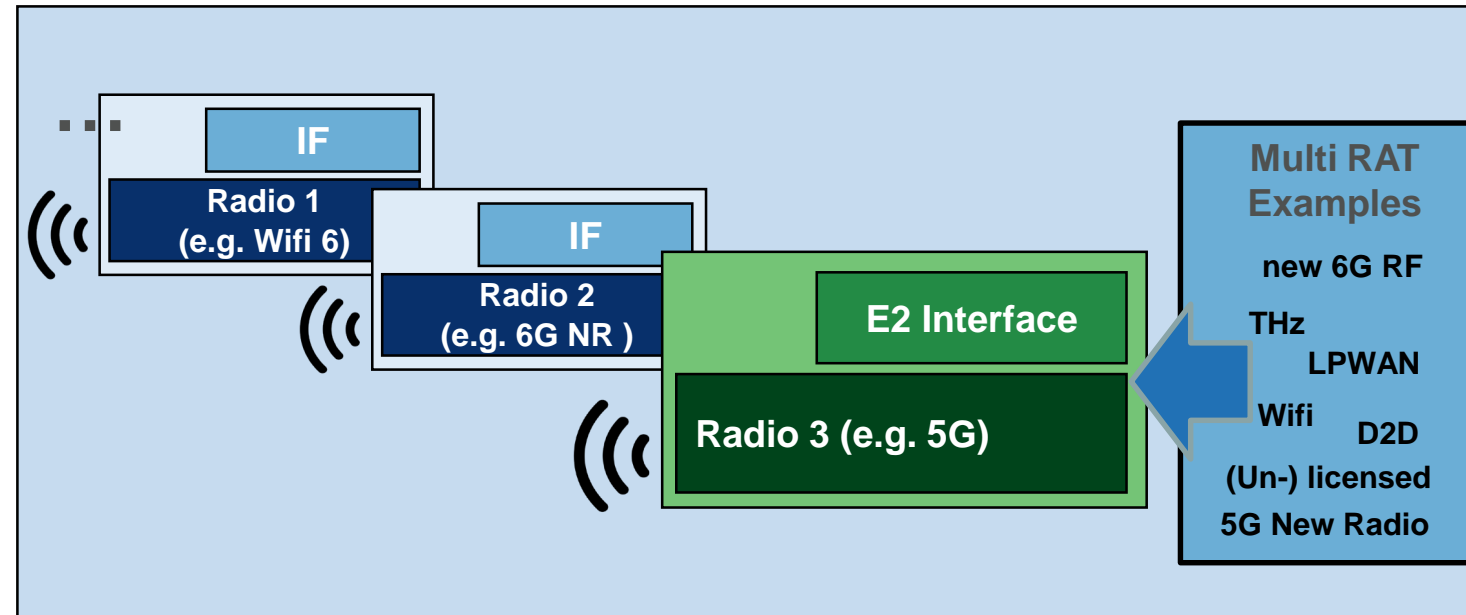
First experiments with networked agile robots producing several HD/360° video streams for immersive situational awareness  
→ serves to enable detailed definition of 6GEM validation scenarios



Youtube-Video:  
Insights into  
Rescue Robotics  
Test Field

# Managing multiple dimensions of future 6G Networks

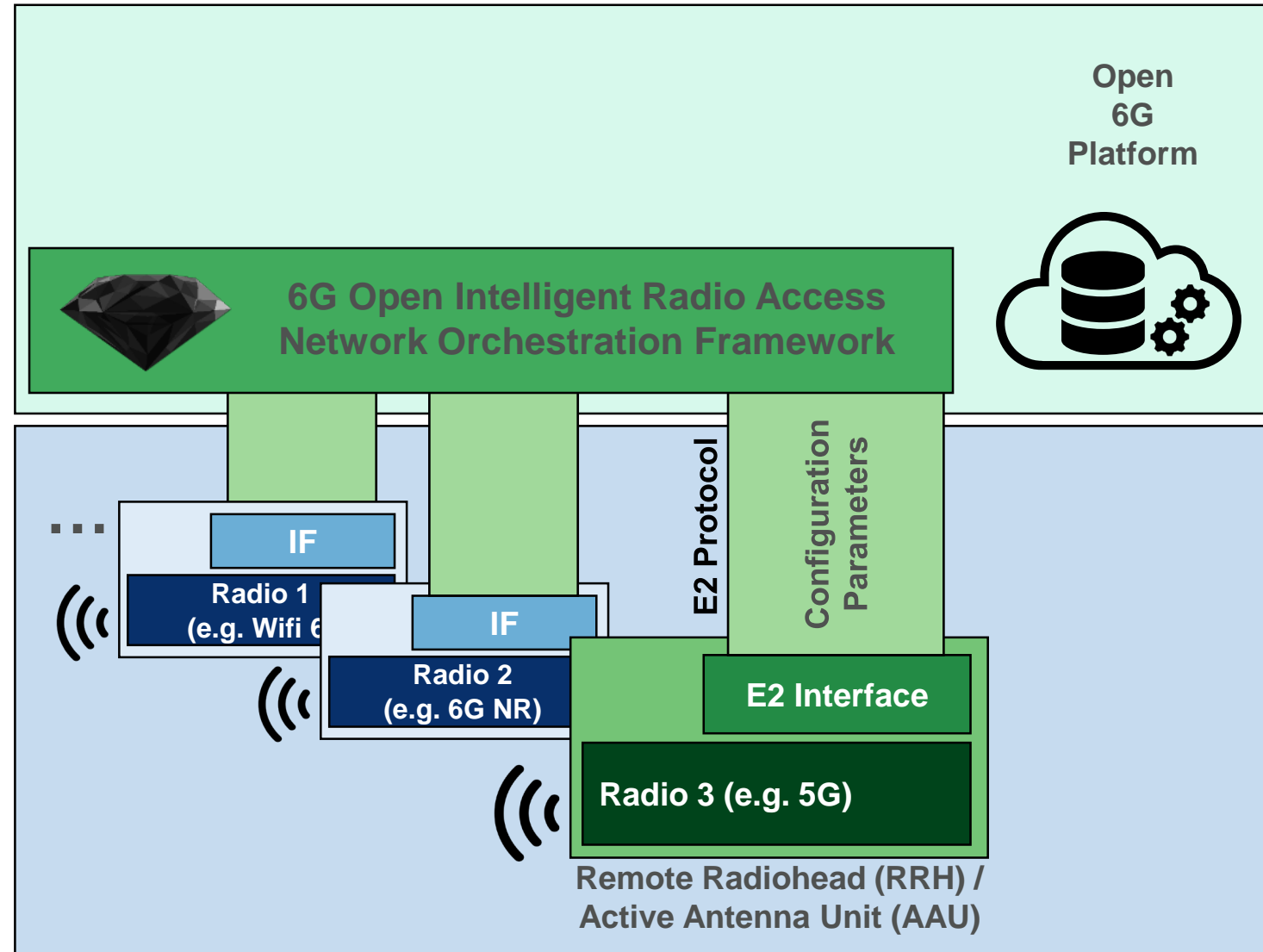
6G New Radio will be one element in a Multi-Radio-Access-Technology environment



# Managing multiple dimensions of future 6G Networks

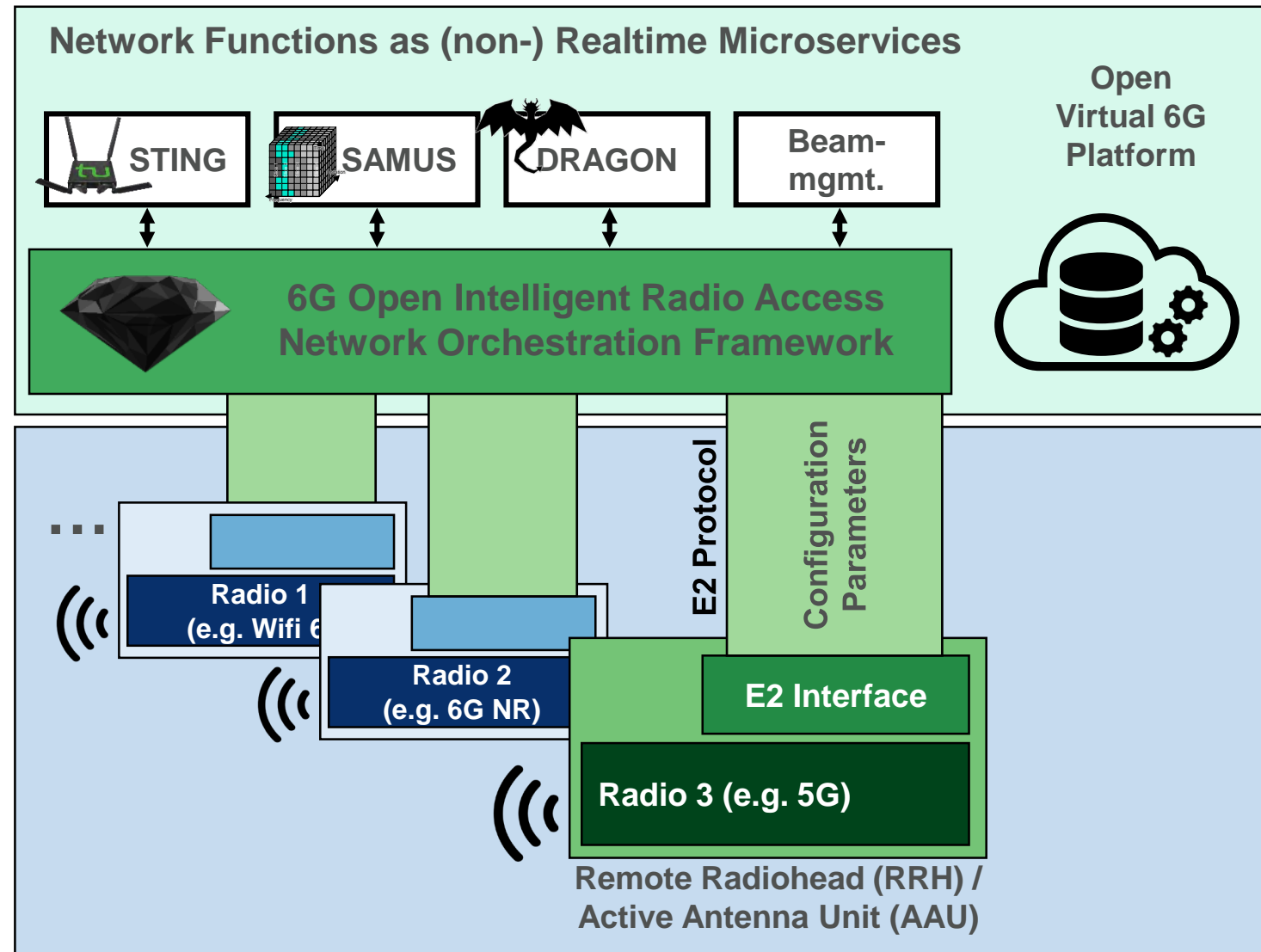
Proposed Framework  
for the Orchestration of  
Multi-RAT environments

cf. Evolved 6G-RIC  
(RAN Intelligent Controller)



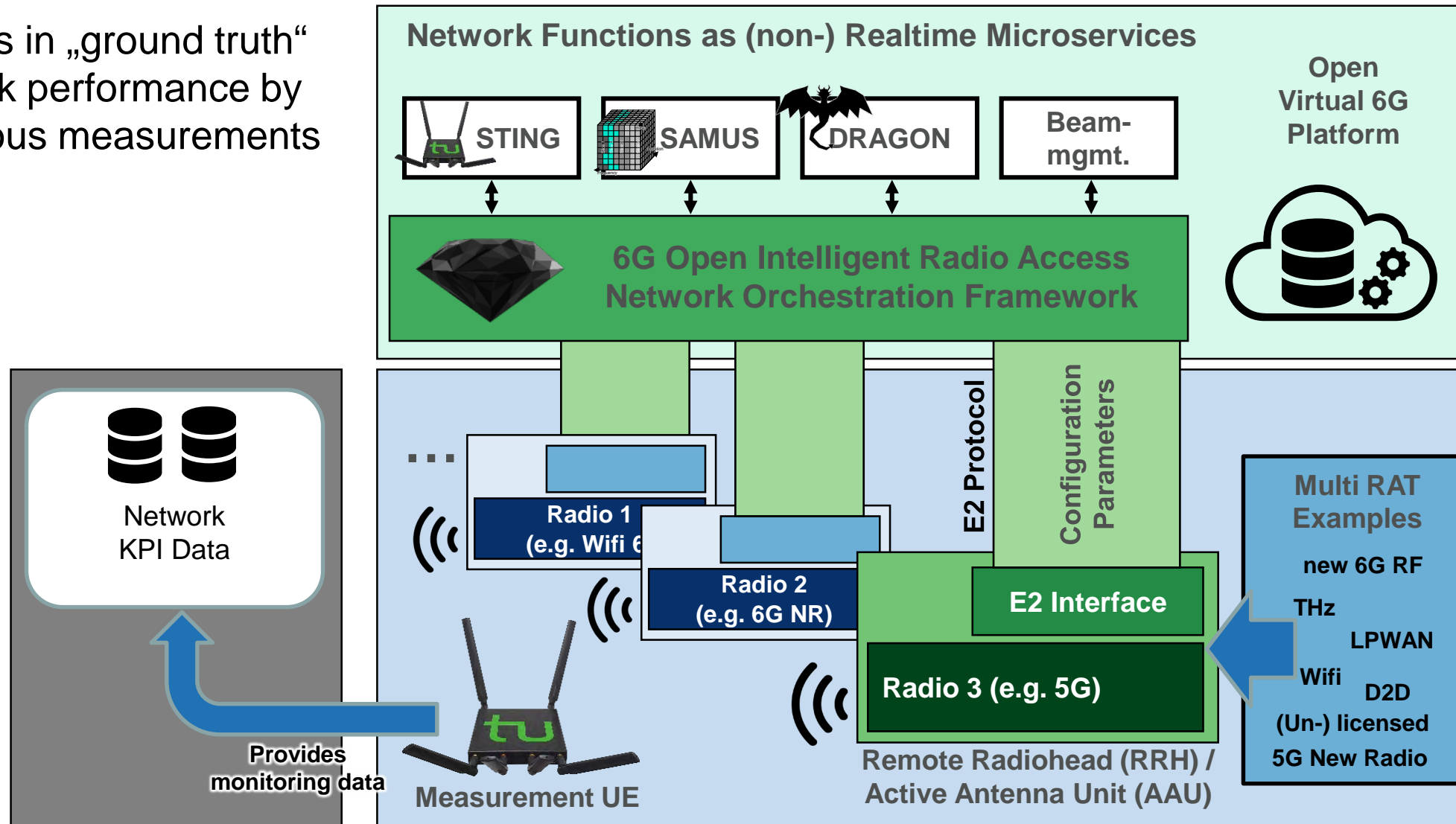
# Managing multiple dimensions of future 6G Networks

Network Innovations via micro services



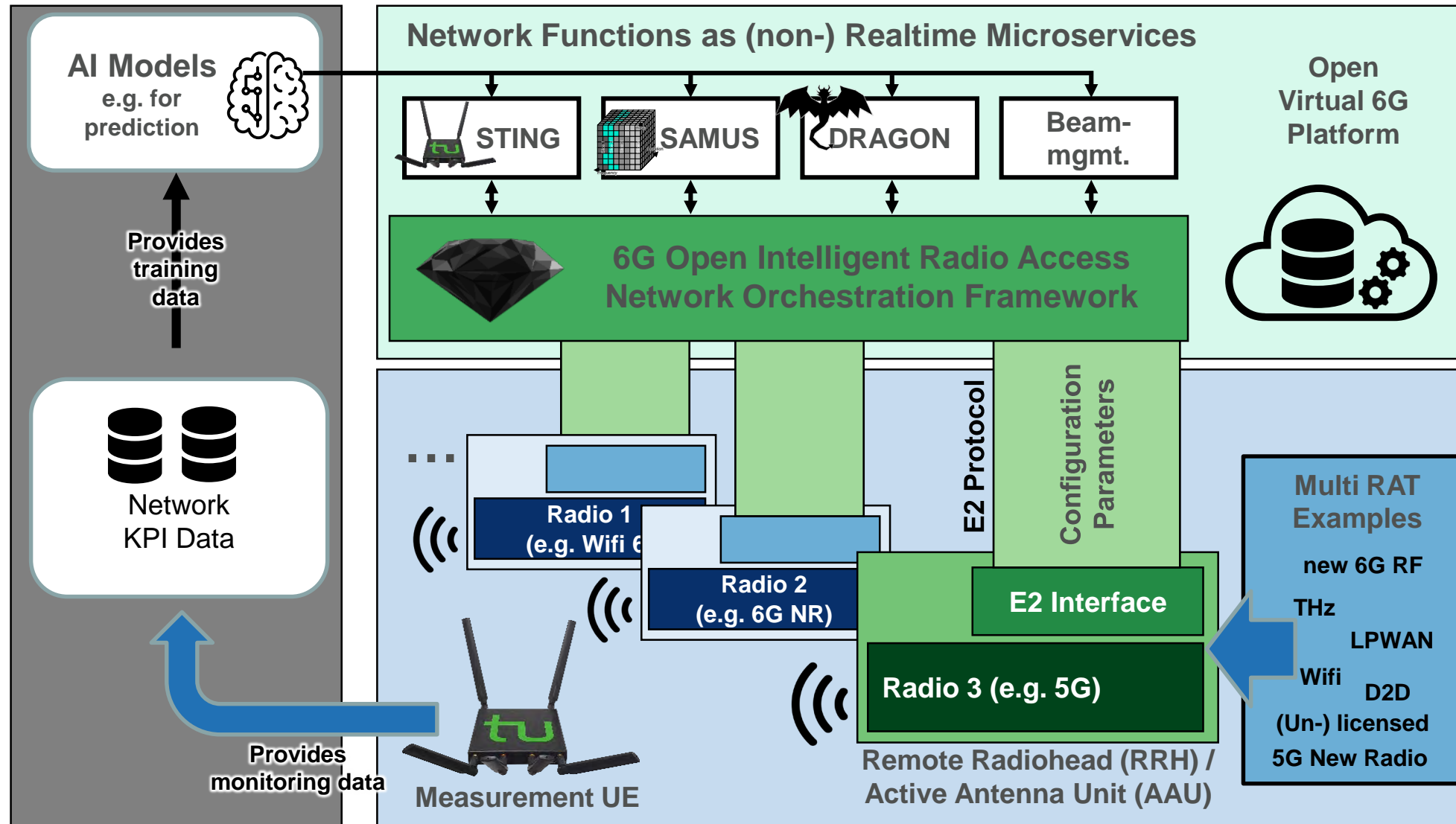
# Managing multiple dimensions of future 6G Networks

Insights in „ground truth“ network performance by continous measurements





# Data-driven Management of multiple dimensions of future 6G Networks



# Selected research approaches for data-driven, multi-dimensional networks

## Proposed solution approaches

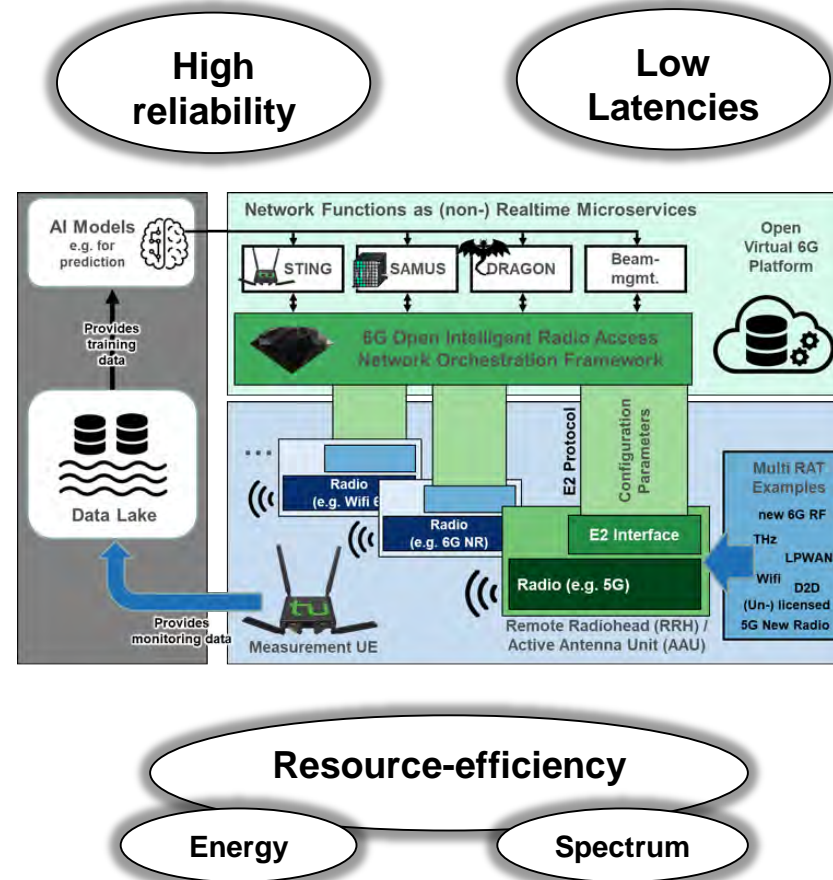
### Specific Methods

**Ground Truth KPI Monitoring & Prediction**

**STING**

**6G Open Intelligent Radio Access Network Orchestration Framework**

**6G-evolved RIC**



**Data-driven Accurate Channel Prediction**

**DraGon**

**AI-enabled resource awareness and scheduling**

**SAMUS**

**Programmable mmWave Radio Environments**

**HELIOS**

# Selected research approaches for data-driven, multi-dimensional networks

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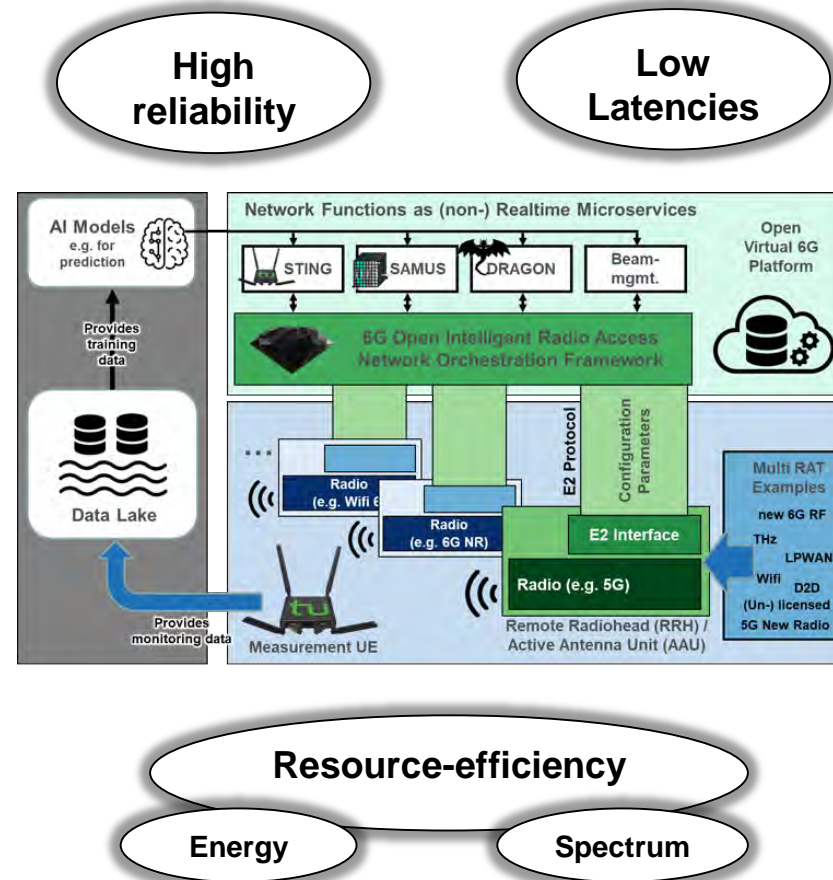
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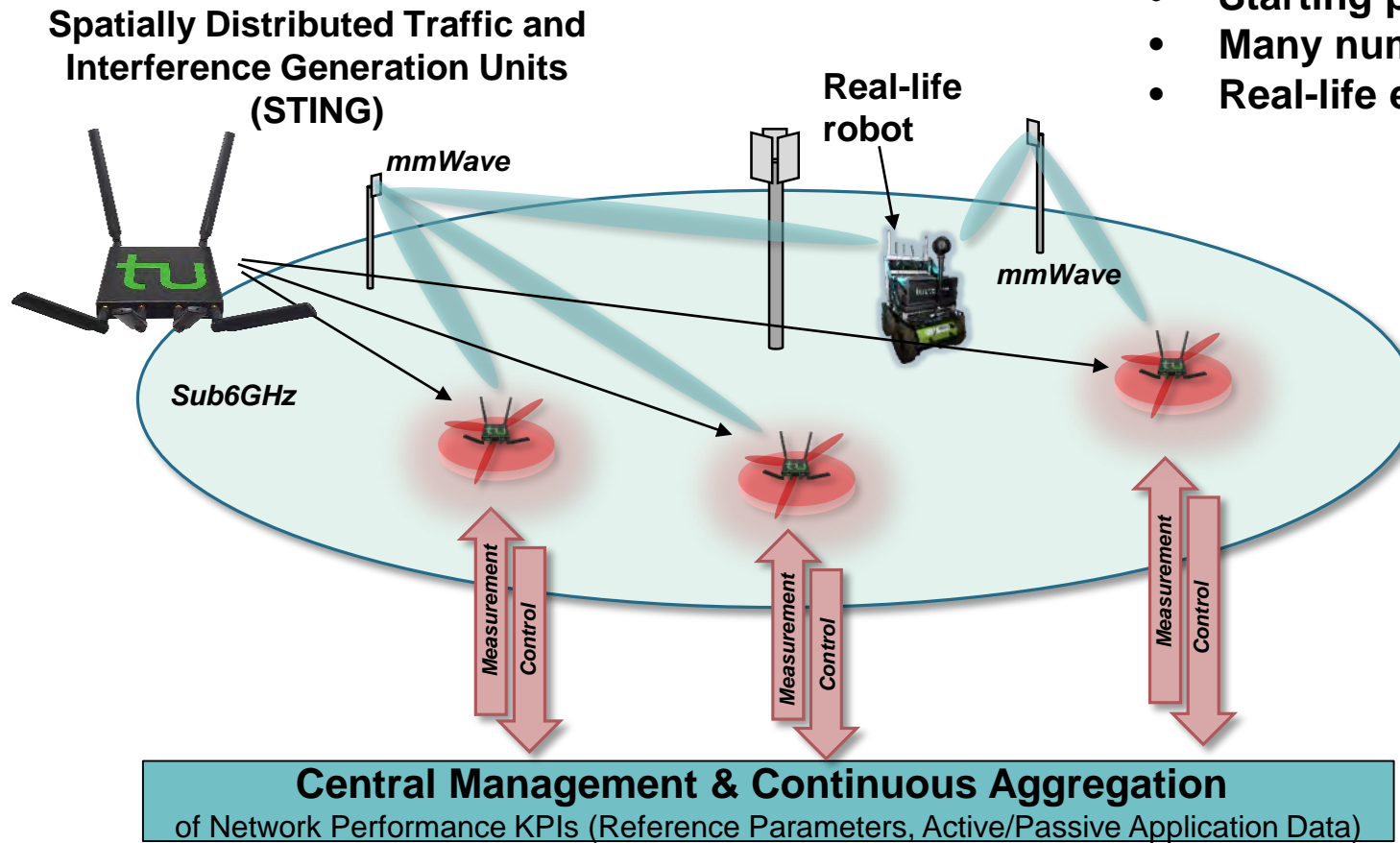
**Programmable mmWave Radio Environments**

**HELIOS**

# Ground Truth KPI monitoring and control

→ Scale the system to the max in an early stage

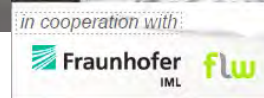
- Starting point: few real-life users
- Many numbers of users emulated by STING
- Real-life environments



production

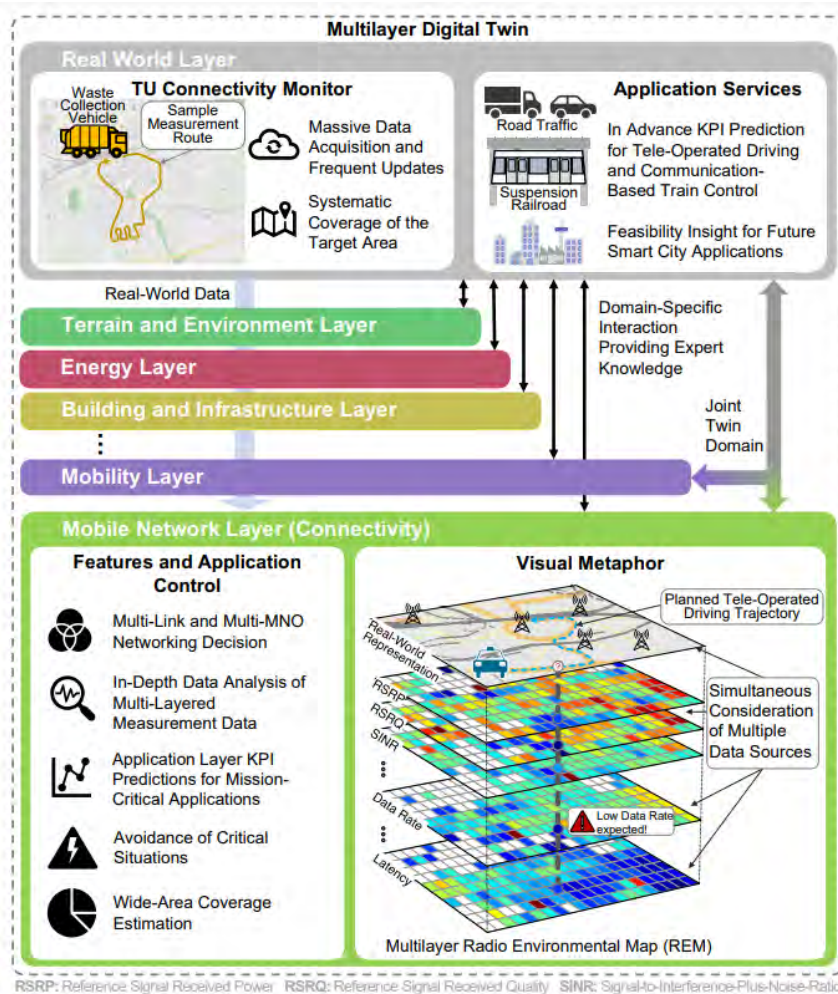


logistics



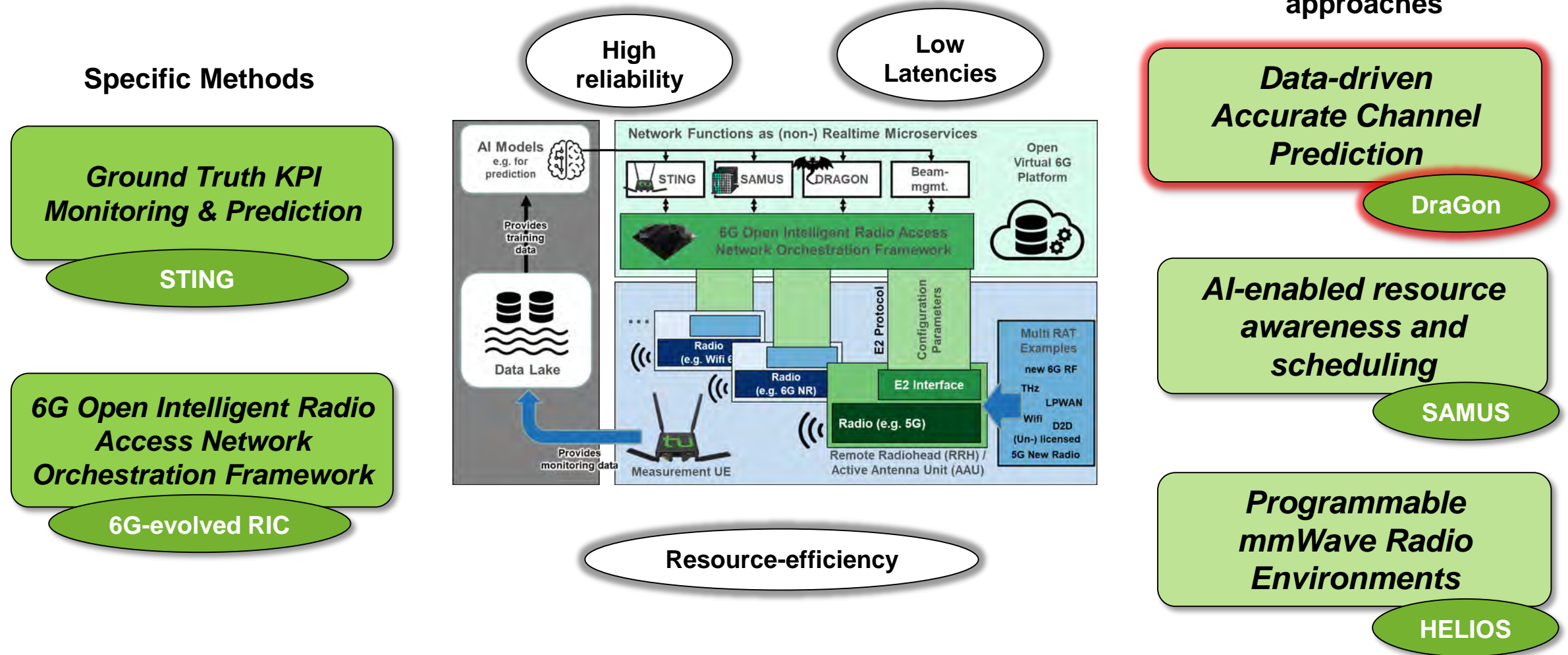
# Ground Truth KPI monitoring & prediction:

→ *Gathering data in the field*



H. Schippers, S. Böcker, C. Wietfeld, "Data-Driven Digital Mobile Network Twin Enabling Mission-Critical Vehicular Applications", In 2023 IEEE 97th Vehicular Technology Conference (VTC-Spring), Florence, Italy, June 2023.

# Selected research approaches for data-driven, multi-dimensional networks

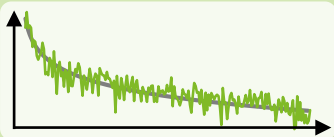


# Data-driven Accurate Channel Prediction

## Limitations of Classic Radio Propagation Modeling

### Empirical Models

- Computationally simple
- Fast
- Satisfactory accuracy



- Not able to mimic complex real world characteristics

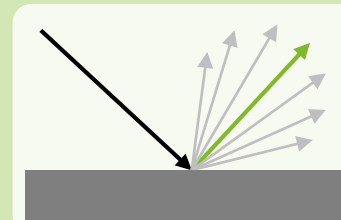


Inaccurate



### Raytracing Models

- Models physical effects
- Accurate prediction



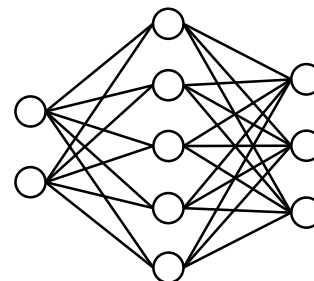
- Computationally expensive
- Time consuming
- Geographical data exhaustive



High effort

New approach

**Machine Learning based Propagation Modeling**



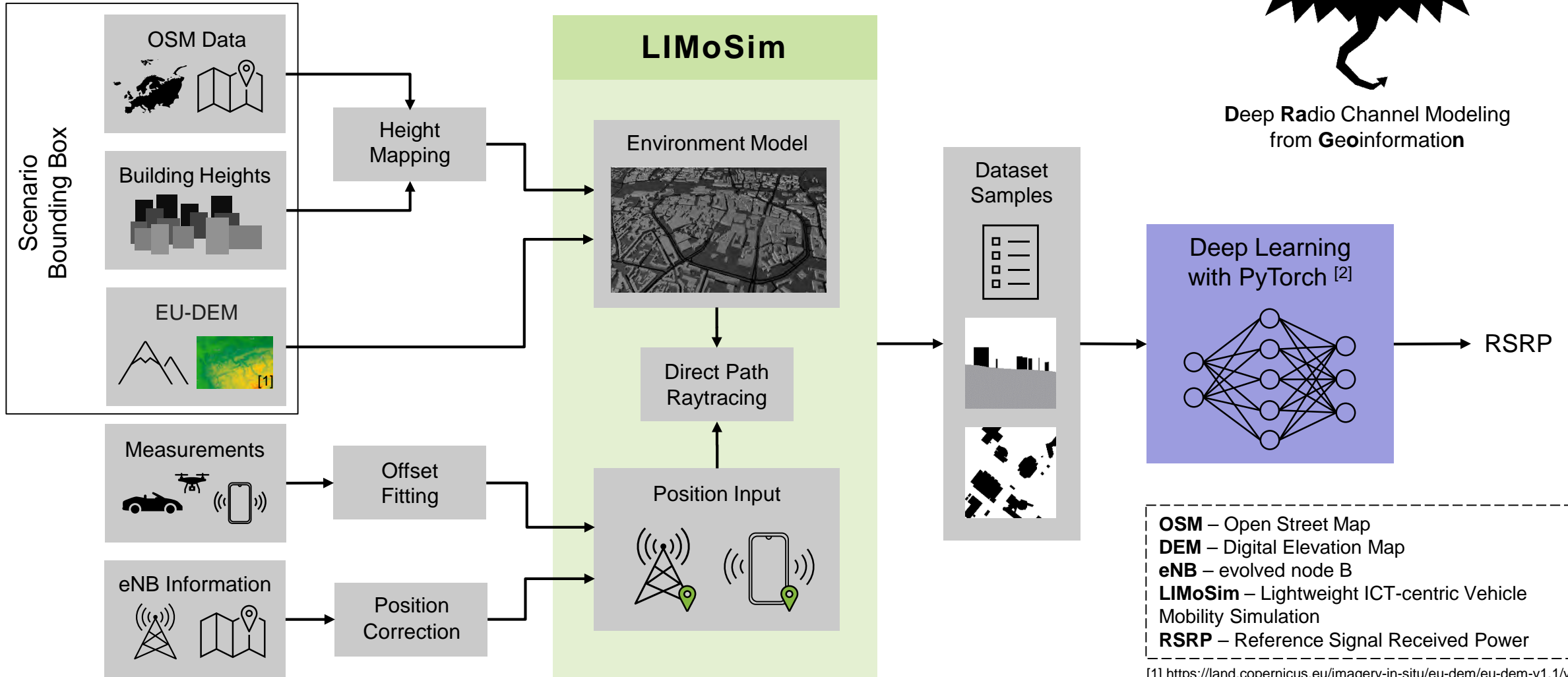
**DRaGon:**  
*Deep Radio Channel Modeling from Geoinformation*

# DRaGon: Data-driven Accurate Channel Prediction

## Leveraging channel measurements and open geo models



Deep Radio Channel Modeling from Geoinformation



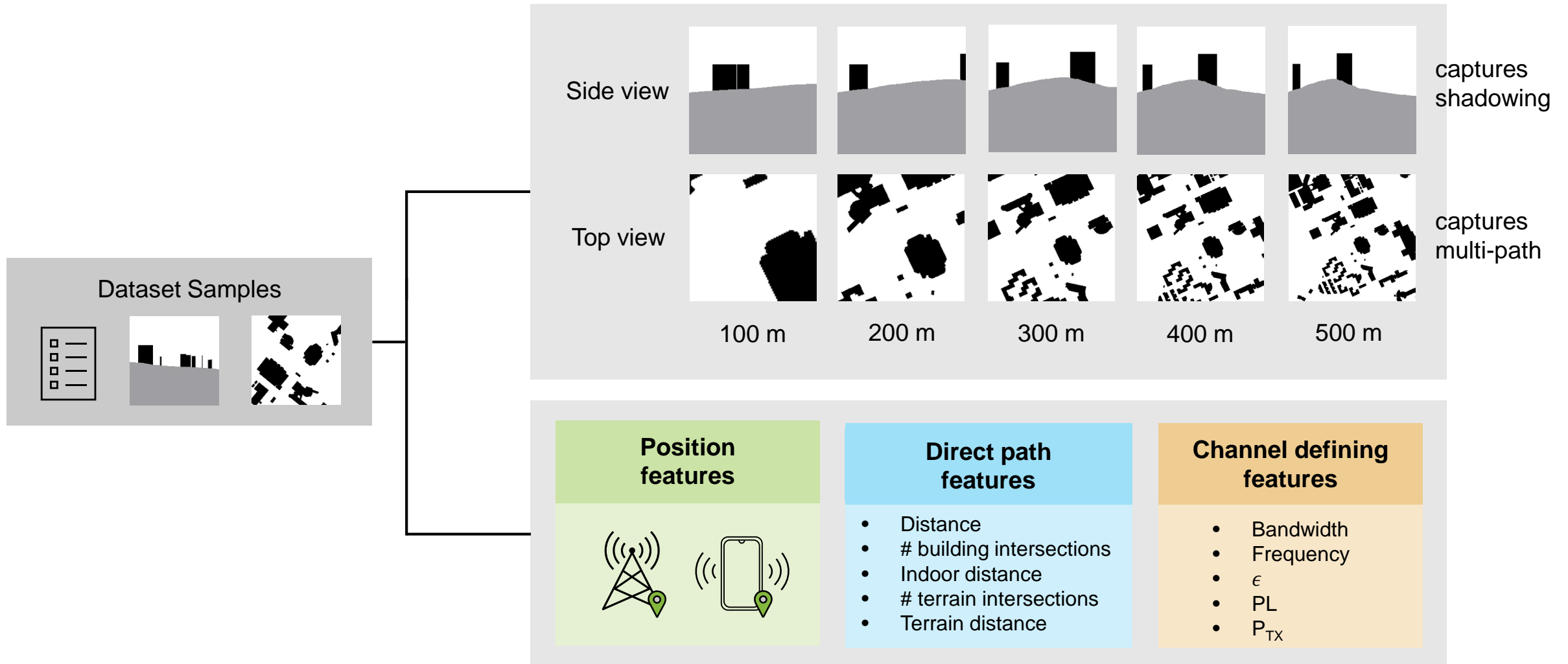
**OSM** – Open Street Map  
**DEM** – Digital Elevation Map  
**eNB** – evolved node B  
**LIMoSim** – Lightweight ICT-centric Vehicle Mobility Simulation  
**RSRP** – Reference Signal Received Power

[1] <https://land.copernicus.eu/imagery-in-situ/eu-dem/eu-dem-v1.1/view>  
 [2] <https://pytorch.org/>



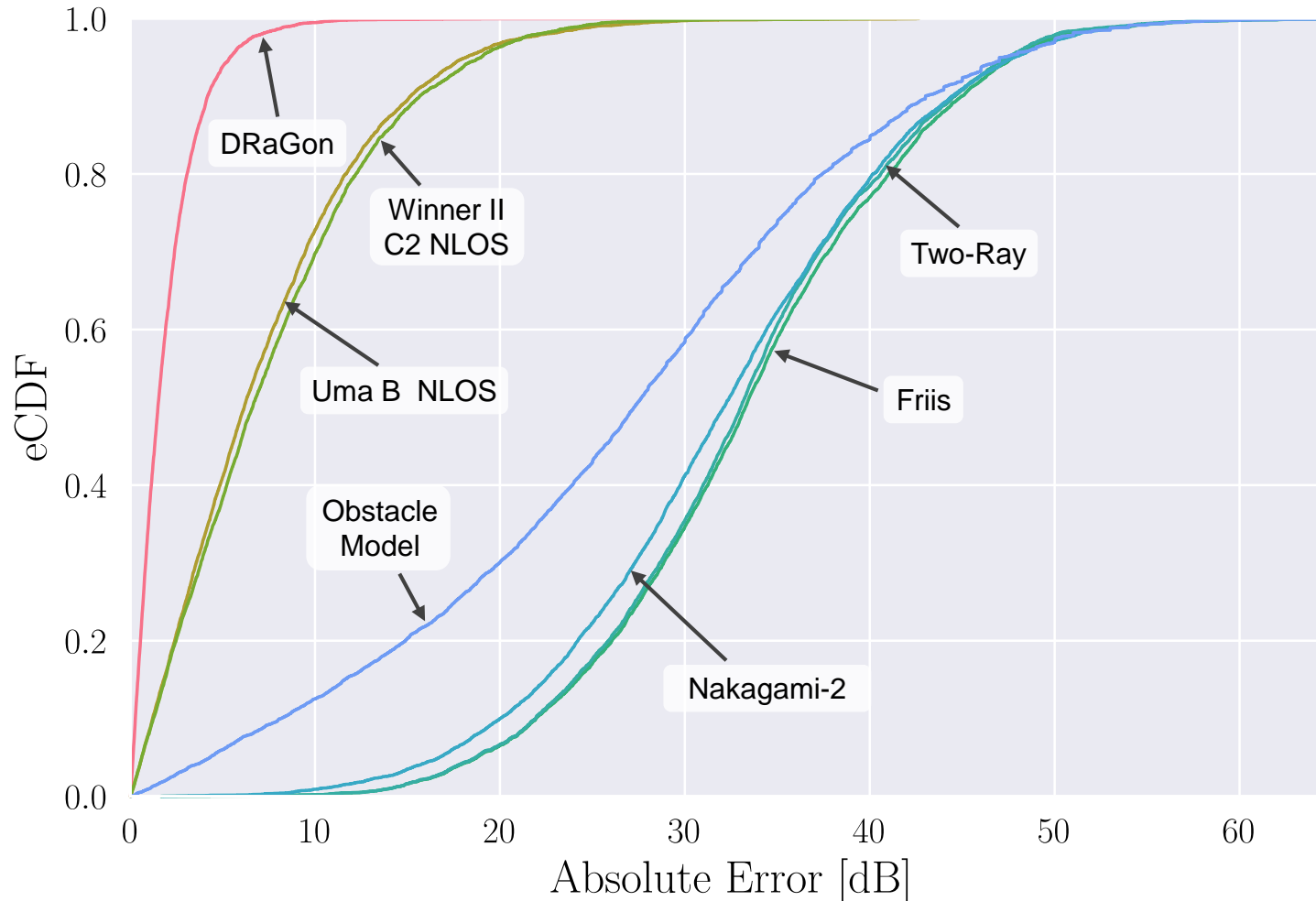
# DRaGon: Data-driven Accurate Channel Prediction

## Feature Extraction from 3D geo data & wireless network system parameters



# DRaGon: Data-driven Accurate Channel Prediction

## *DraGon outperforms empirical models*

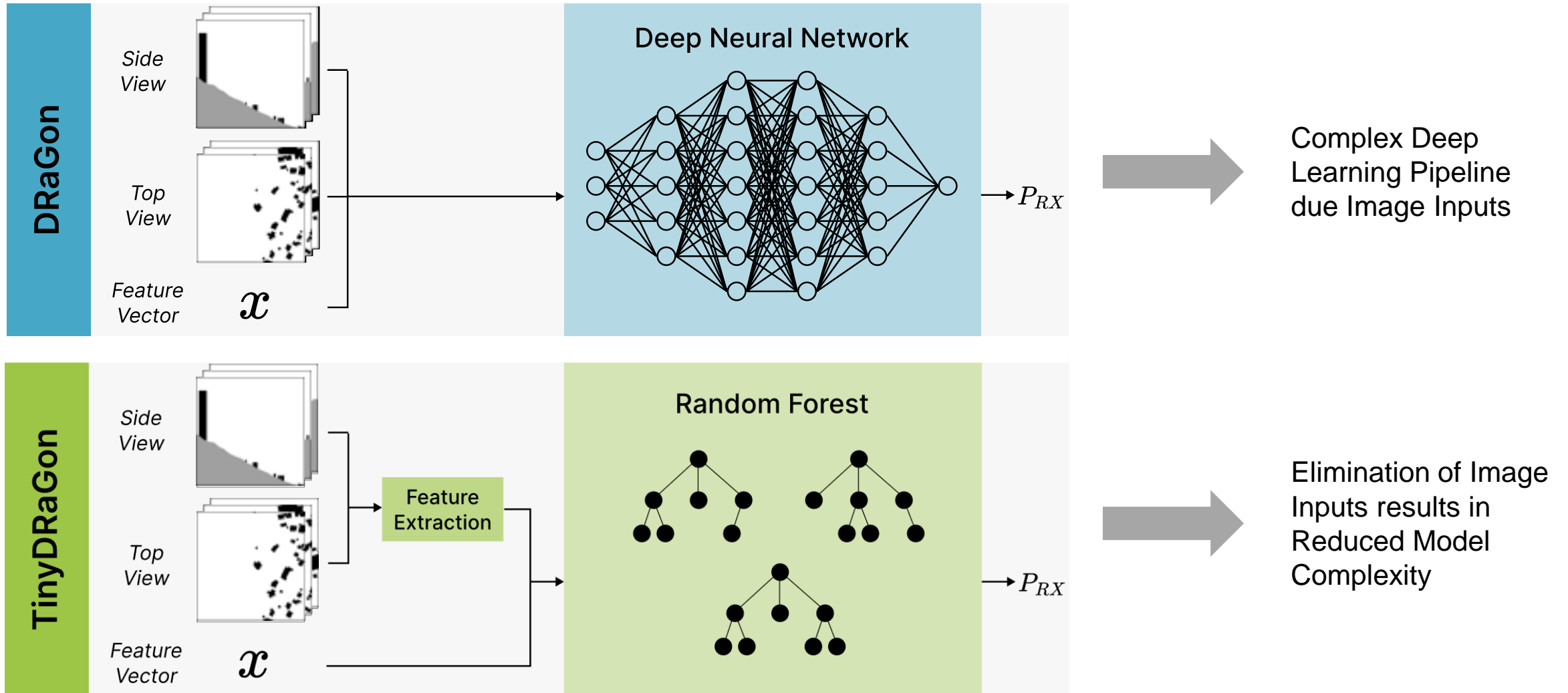


Model	RMSE [dB]
DRaGon	2.70
Uma B NLOS	9.33
Winner II C2 NLOS	9.61
Obstacle Model	29.49
Nakagami-2	33.52
Two-Ray	34.17
Friis	34.49

RMSE – Root Mean Square Error  
eCDF – empirical Cumulative Distribution Function

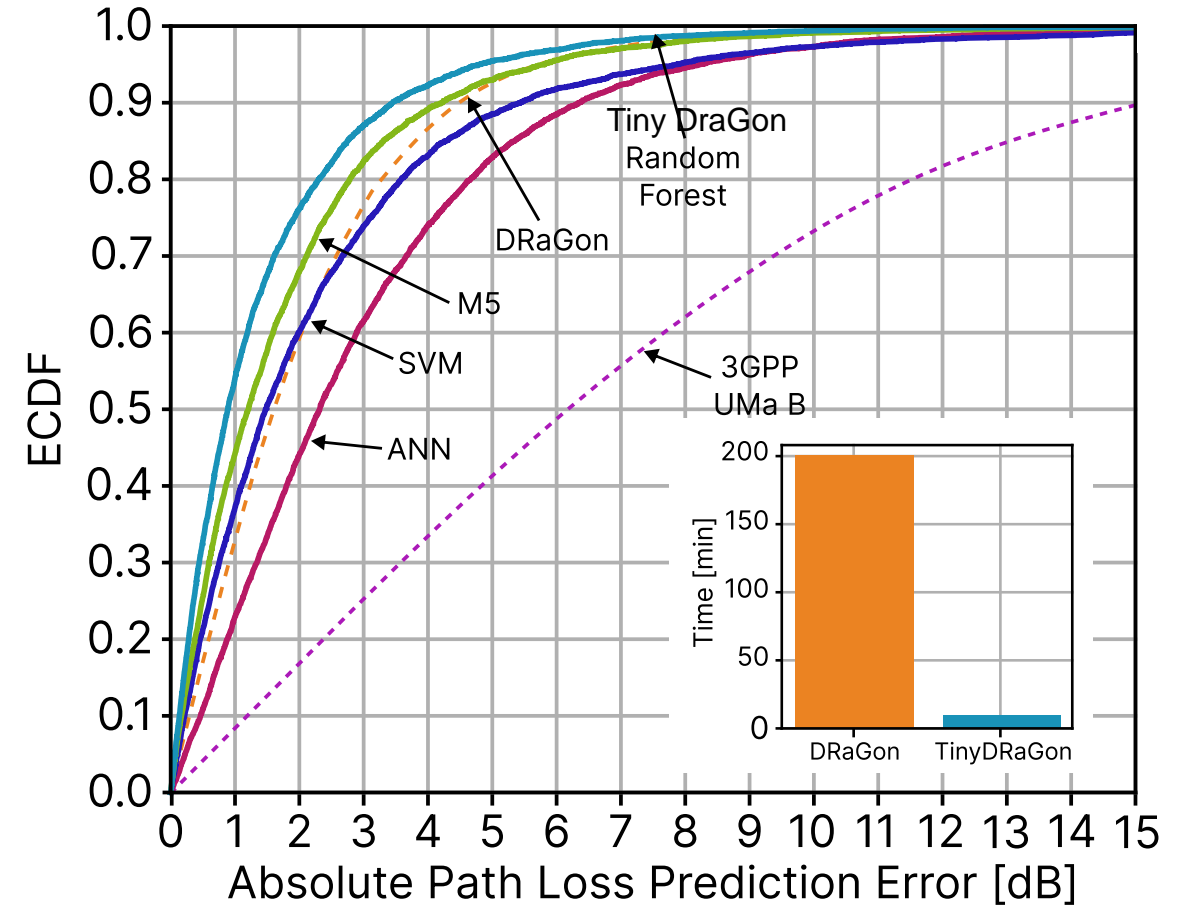
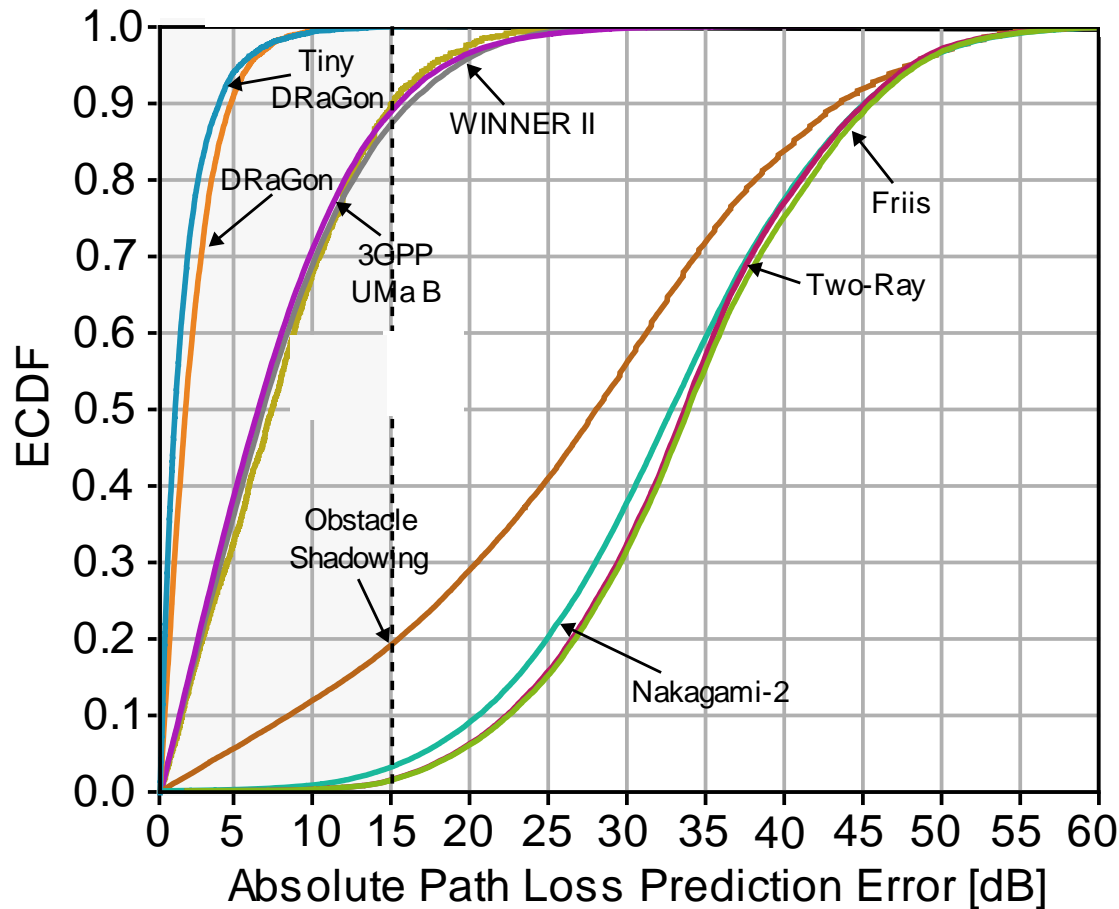
# DRaGon: Data-driven Accurate Channel Prediction

## Reducing complexity by alternative ML methods and further feature extraction



# DRaGon: Data-driven Accurate Channel Prediction

## Deep learning is not always the best choice

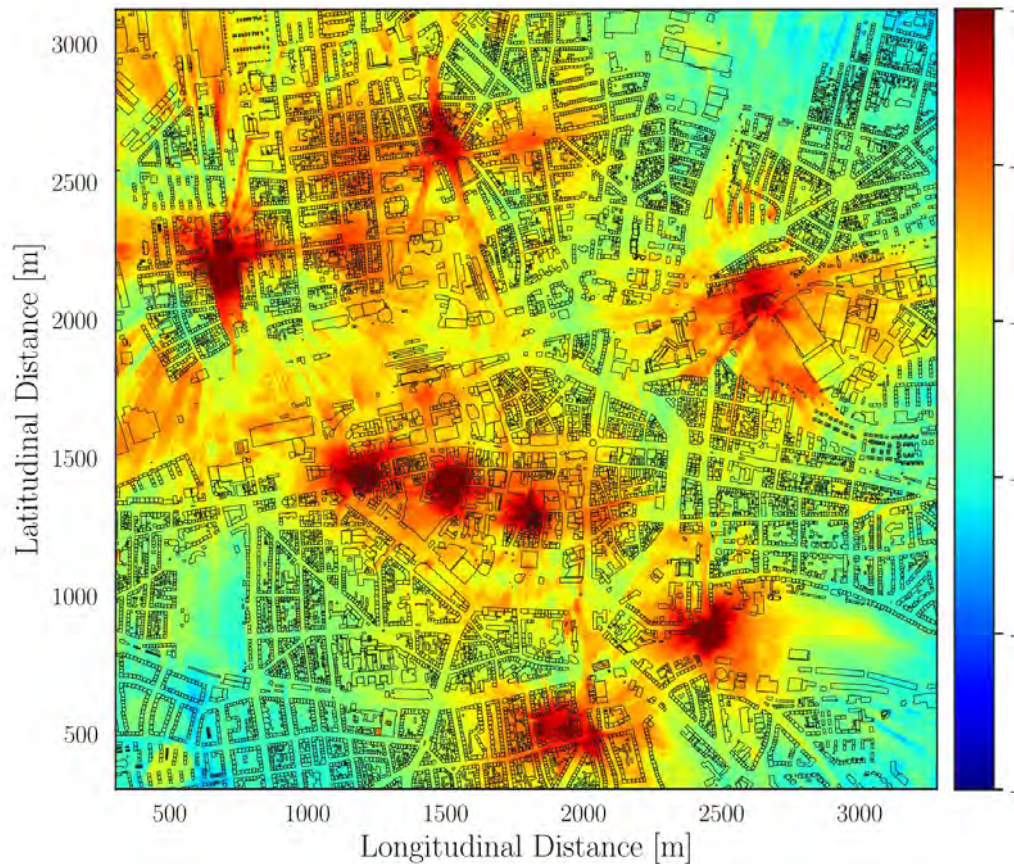


**RMSE** – Root Mean Square Error      **ECDF** – Empirical Cumulative Distribution Function

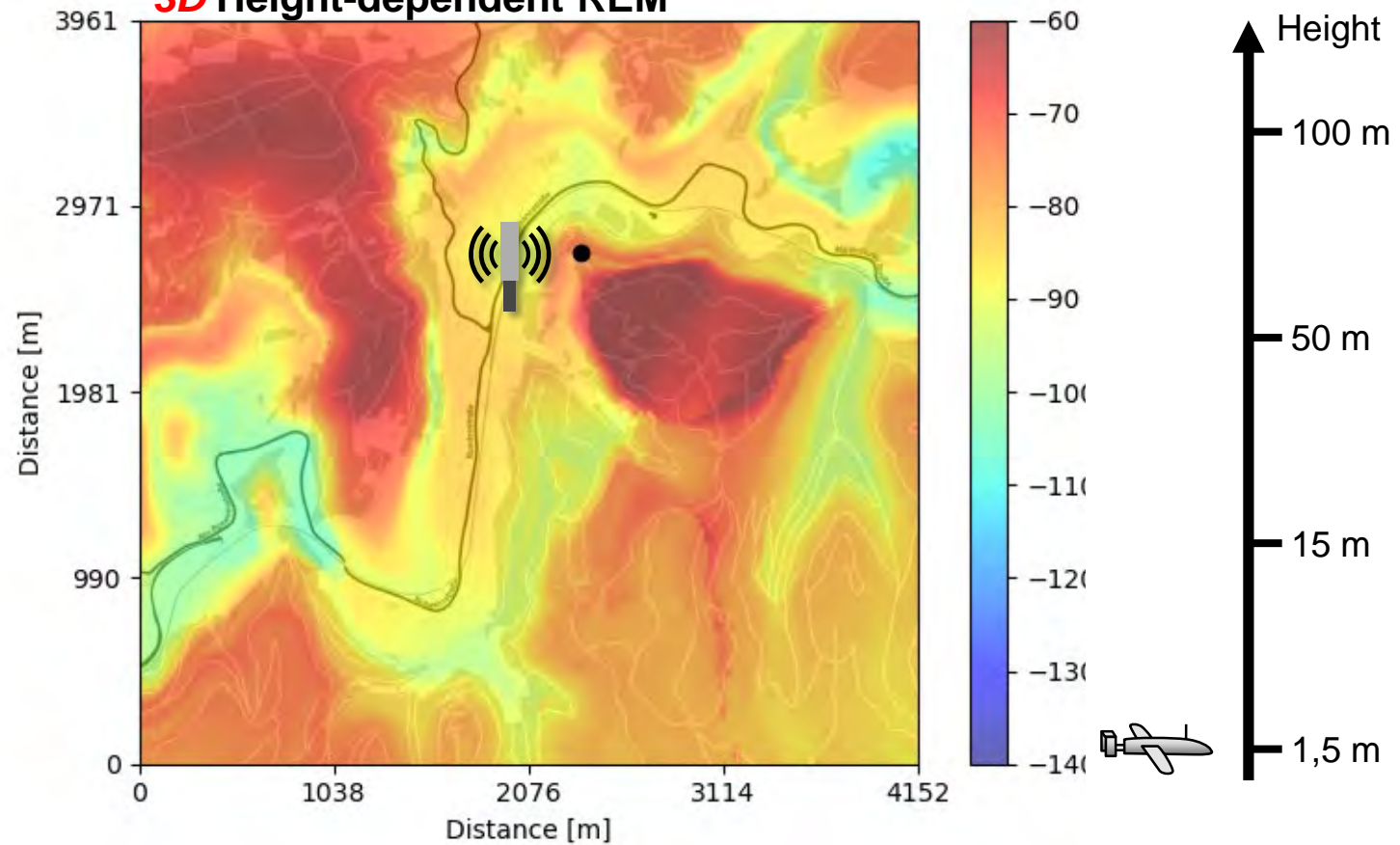
# DRaGon: Data-driven Accurate Channel Prediction

## Derivation of Radio Environmental maps based on available geo models

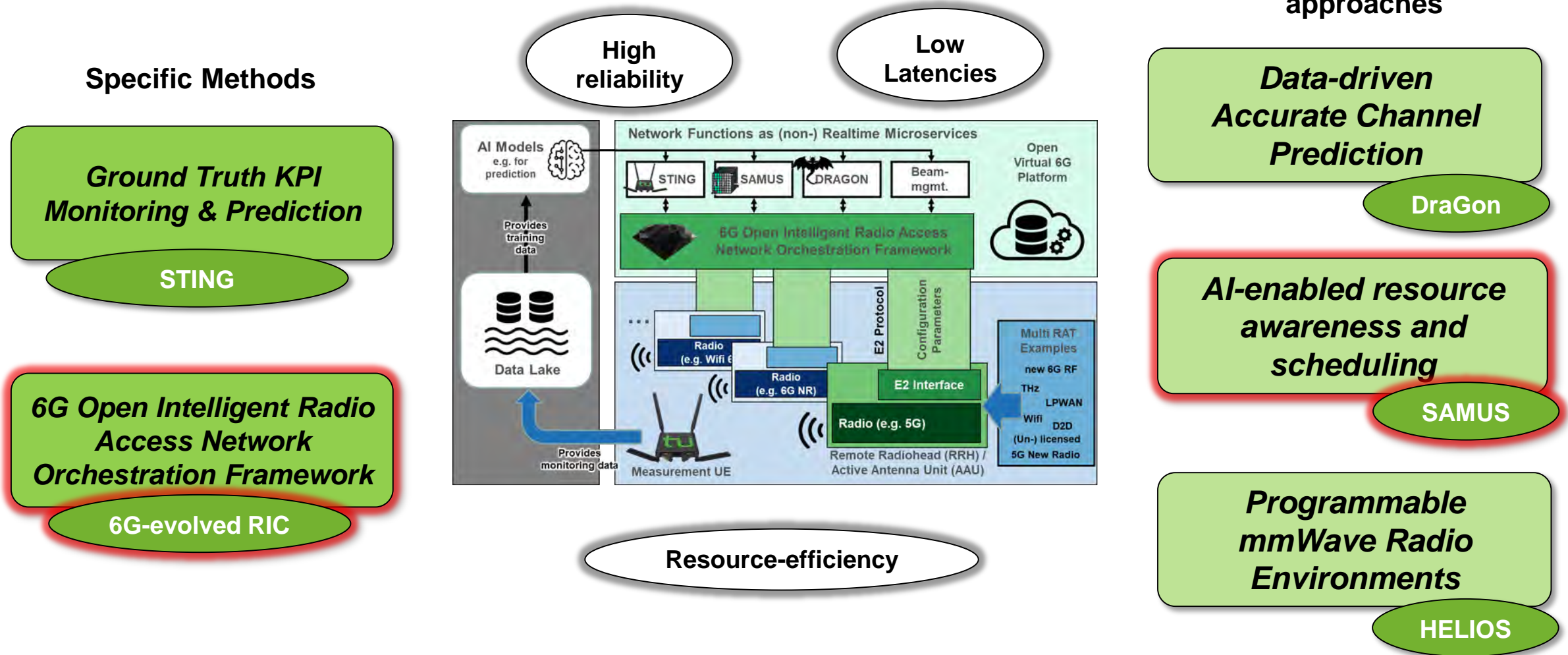
**2D REM**



**3D Height-dependent REM**



# Selected research approaches for data-driven, multi-dimensional networks



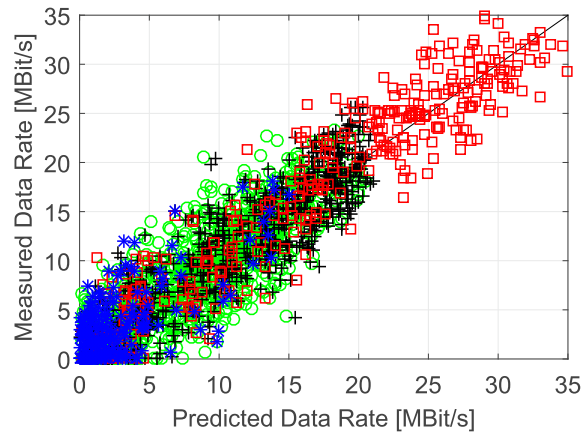
# AI-enabled resource awareness and scheduling on Client-side: CAT: Channel-Aware Transmission



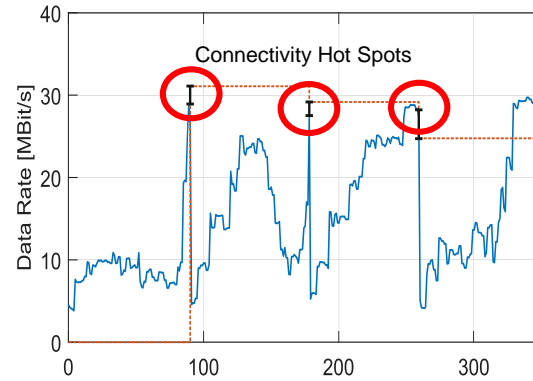
## ML-enabled opportunistic scheduling decisions

Learning the complex behaviour of mobile networks

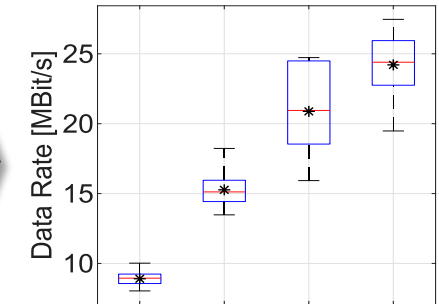
Datarate prediction with passive indicators using *Random Forests*



Opportunistic choice of application-level scheduling using *Reinforcement Learning*

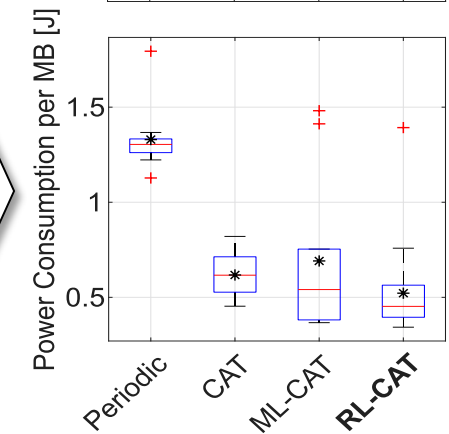


Flexible scheduling leads to **higher data rates**



+171%

Additionally **lower battery consumption**



-80%

Usable not only for Smart Phones, but also **tiny IoT devices**

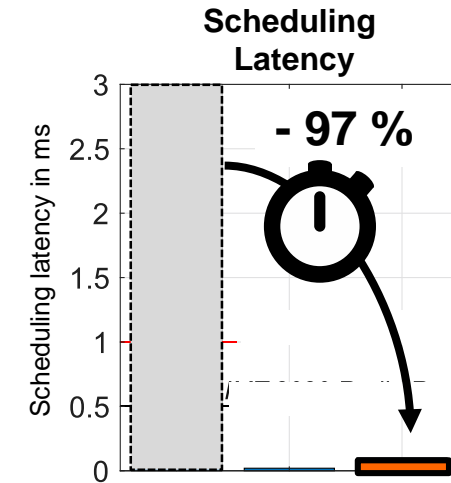
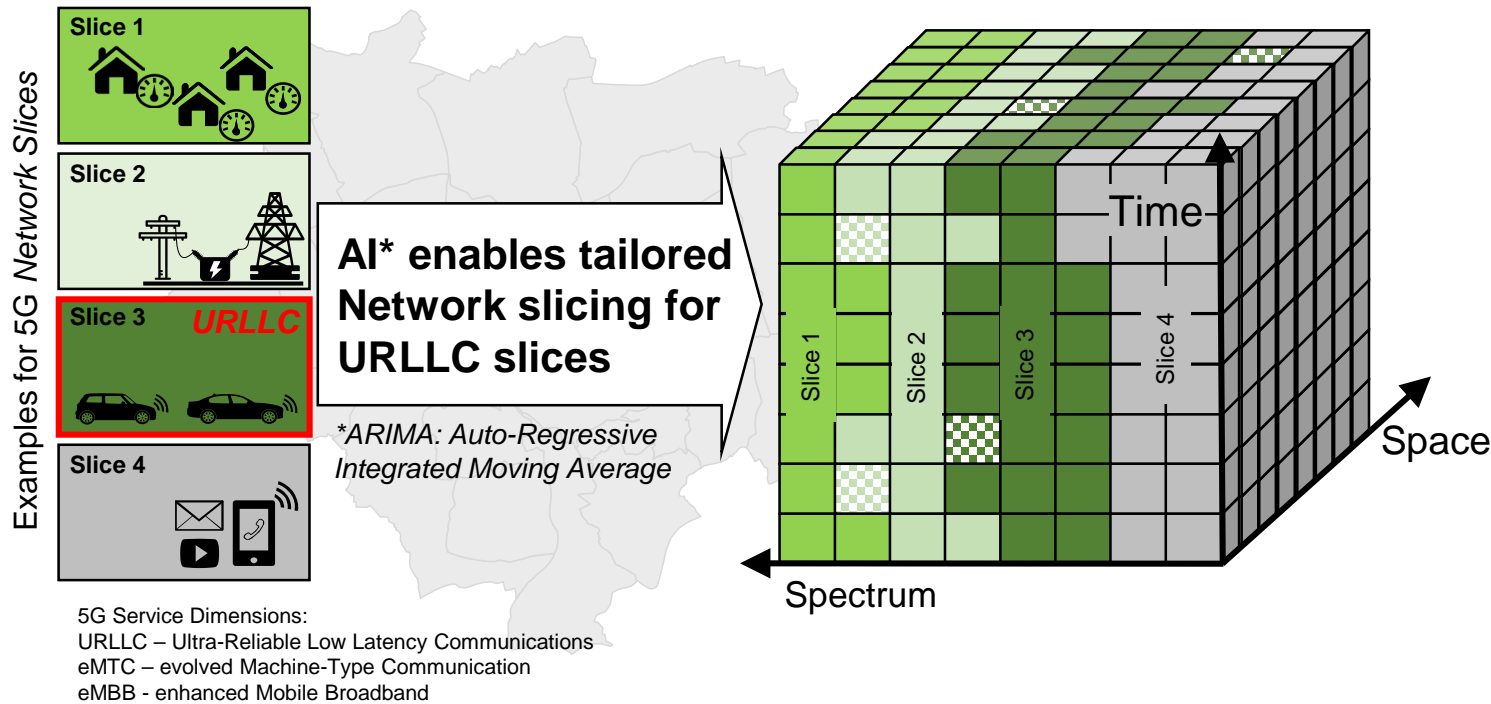


B. Sliwa, C. Wietfeld, "A Reinforcement Learning Approach for Efficient Opportunistic Vehicle-to-Cloud Data Transfer", In 2020 IEEE Wireless Communications and Networking Conference (WCNC).

B. Sliwa, N. Piatkowski, C. Wietfeld, "LIMITS: Lightweight Machine Learning for IoT Systems with Resource Limitations", In 2020 IEEE International Conference on Communications (ICC), (Best Paper Award).

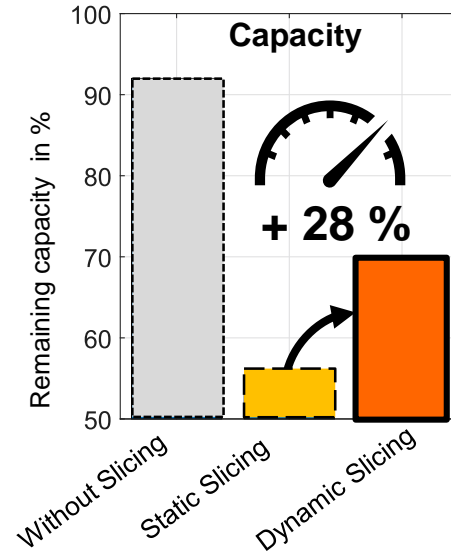
# AI-enabled resource awareness and scheduling on Network-side SAMUS: Slice-Aware Machine Learning-based Ultra-Reliable Scheduling

## Dynamic Mixed-Critical Network Slicing



**Without Slicing:**  
*Latency requirement violated*

**With static slicing:**  
*Latency requirement fulfilled, yet inefficient*

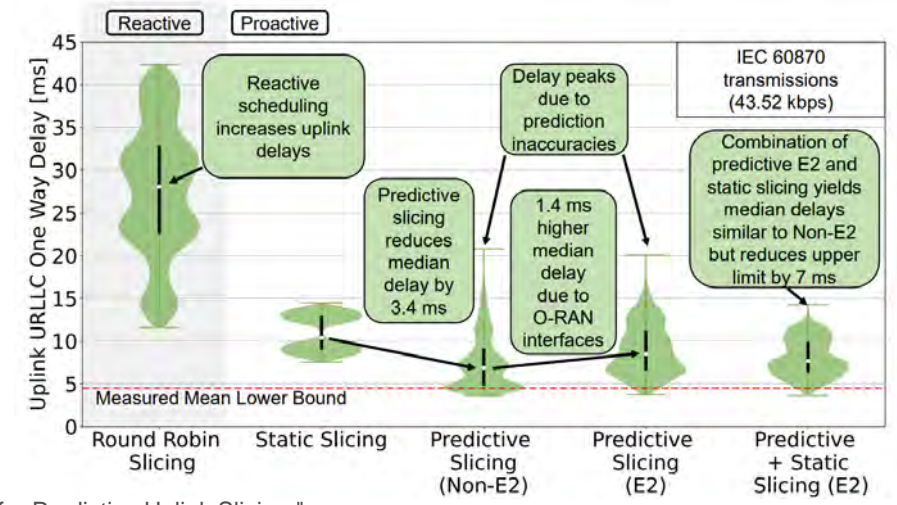
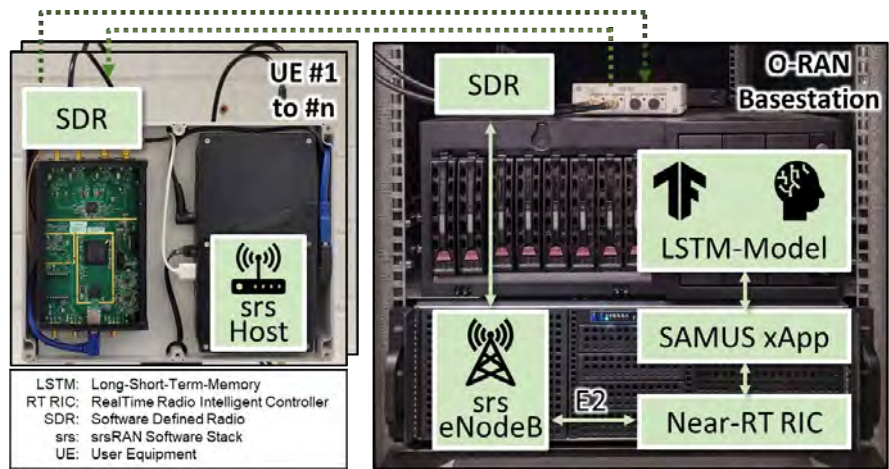
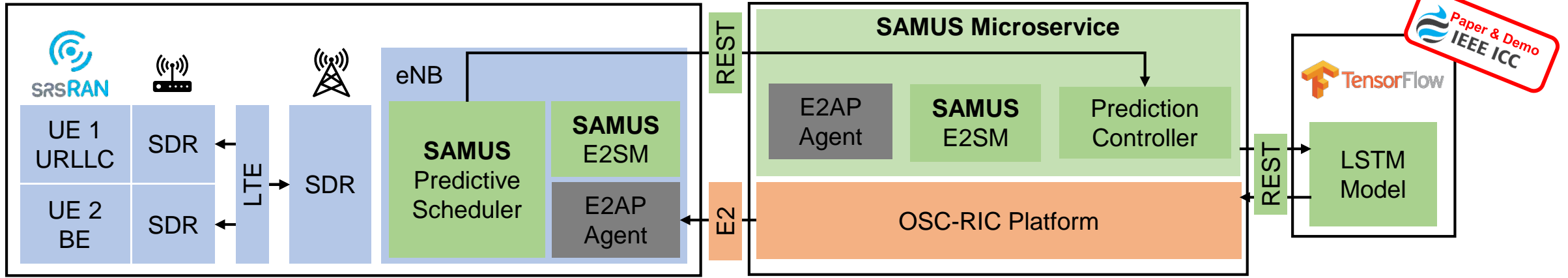


**Dynamic Slicing with AI:**  
*Latency requirement fulfilled, yet more efficient*

C. Bektas, D. Overbeck, C. Wietfeld, **SAMUS: Slice-Aware Machine Learning-based Ultra-Reliable Scheduling**, IEEE International Communications Conference ICC 2021.



# AI-enabled resource awareness and scheduling on the network side: *openSAMUS: Realization as microservice on top of open platform*



R. Wiebusch, N. A. Wagner, D. Overbeck, F. Kurtz, C. Wietfeld, "Towards Open 6G: Experimental O-RAN Framework for Predictive Uplink Slicing,"  
In 2023 IEEE International Conference on Communications (ICC), Rome, Italy, May 2023.

# Selected research approaches for data-driven, multi-dimensional networks

## Specific Methods

**Ground Truth KPI Monitoring & Prediction**

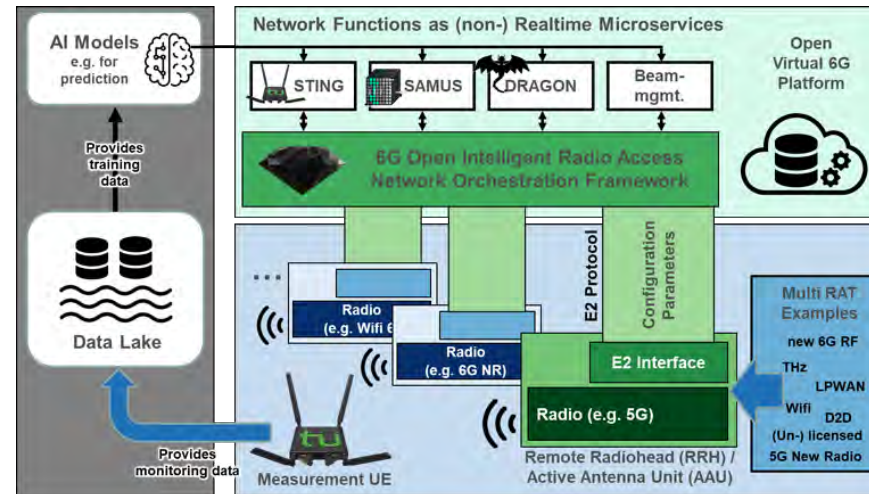
**STING**

**6G Open Intelligent Radio Access Network Orchestration Framework**

**6G-evolved RIC**

High reliability

Low Latencies



Resource-efficiency

## Proposed solution approaches

**Data-driven Accurate Channel Prediction**

**DraGon**

**AI-enabled resource awareness and scheduling**

**SAMUS**

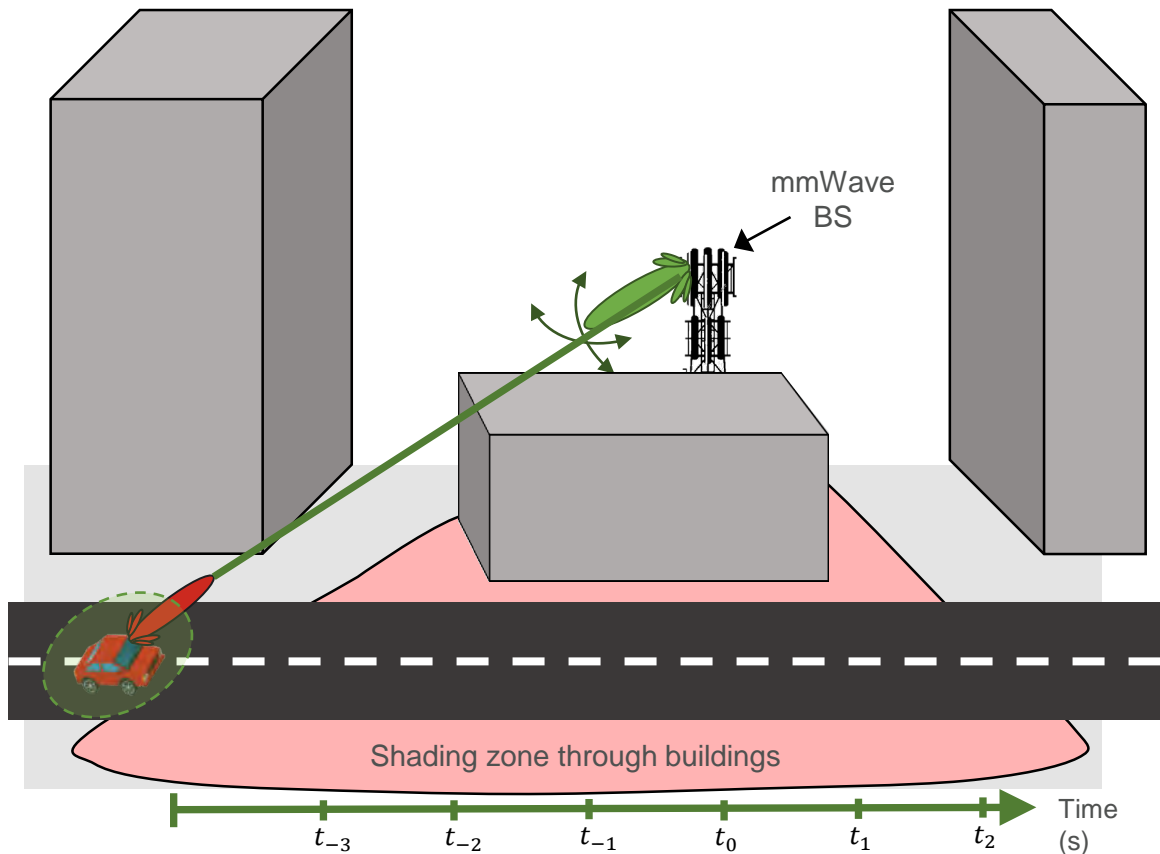
**Programmable mmWave Radio Environments**

**HELIOS**

# Programmable mmWave Radio Environments

## Introducing intelligent surfaces as new network components

**Problem:** Controllable antennas for high frequencies (mmwaves) allow tracking, but require line-of-sight

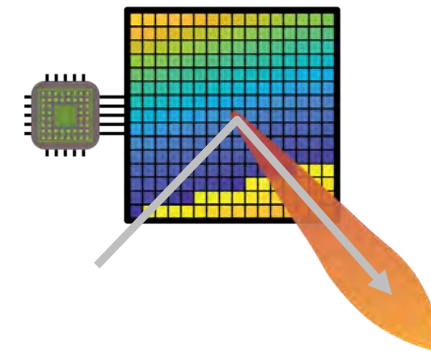


*Different approaches to solutions under discussion*

**Additional base station(s)**



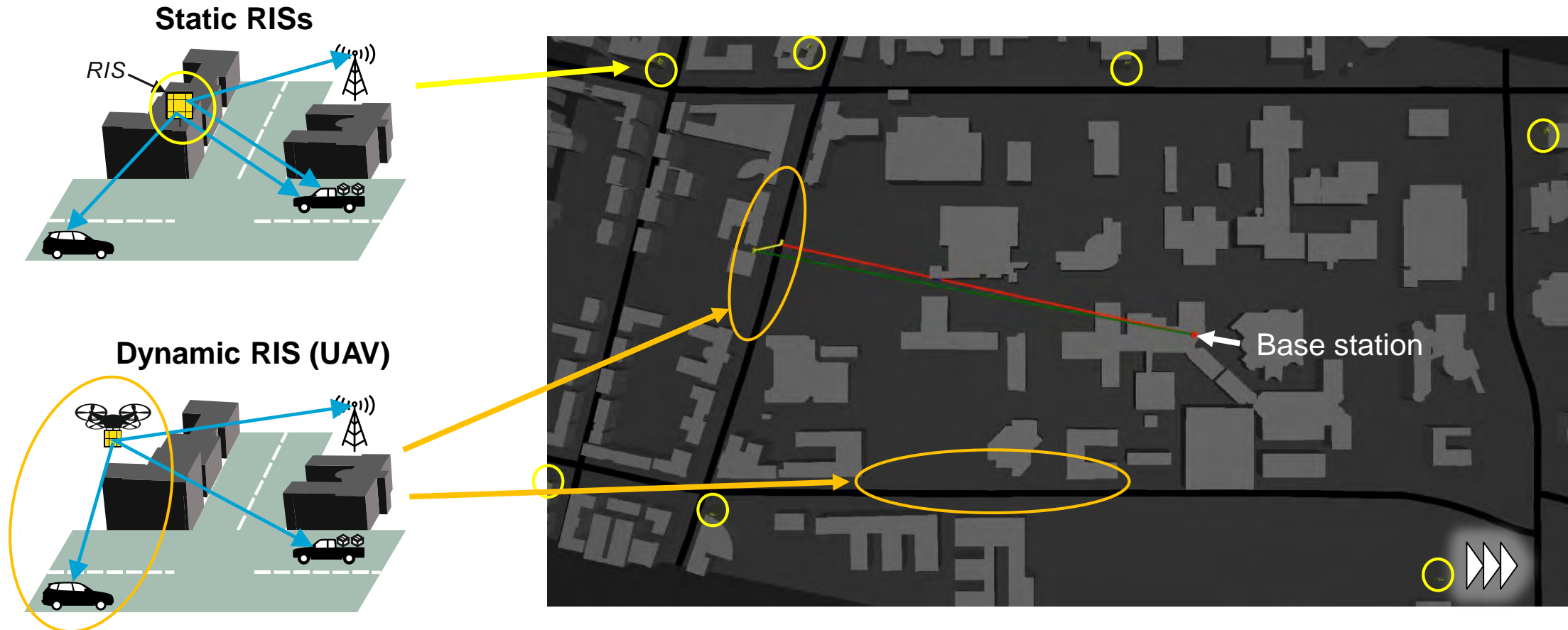
**Reconfigurable Intelligent Surfaces (RIS)**



\*S. Häger, K. Heimann, S. Böcker, C. Wietfeld, "Holistic Enlightening of Blackspots with Passive Tailorable Reflecting Surfaces for Efficient Urban mmWave Networks," In IEEE Access, April 2023. [Online via [IEEE Xplore](https://doi.org/10.1109/ACCESS.2023.3241111)].

# Programmable mmWave Radio Environments

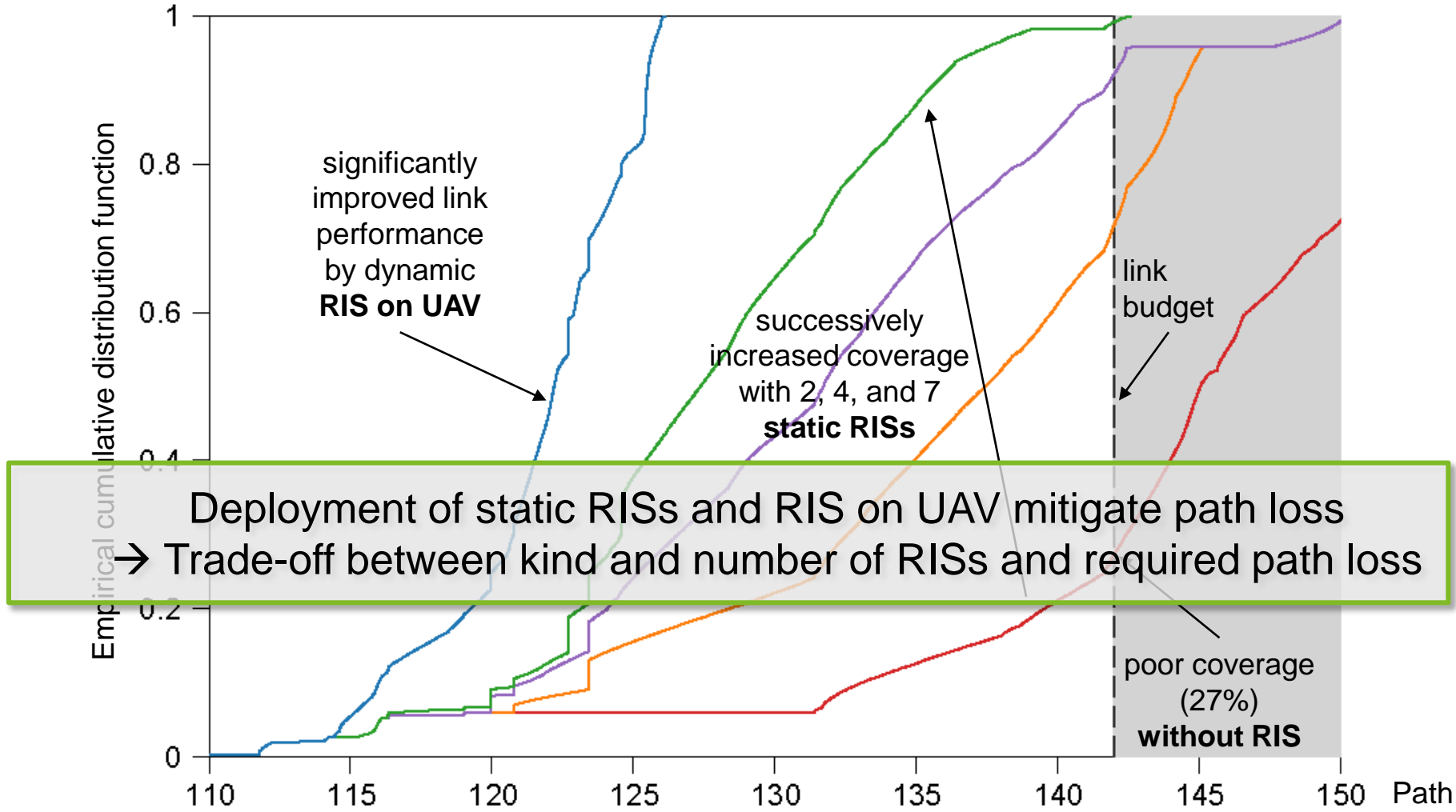
## Analysing the potential of RIS in a simulation study



K. Heimann, B. Sliwa, M. Patchou, C. Wietfeld, "Modeling and simulation of reconfigurable intelligent surfaces for hybrid aerial and ground-based vehicular communications", In Proceedings of the 24th International ACM Conference on Modeling, Analysis and Simulation of Wireless and Mobile Systems, Association for Computing Machinery, Alicante, Spain (Virtual Event), pp. 67–74, November 2021.

# Programmable mmWave Radio Environments

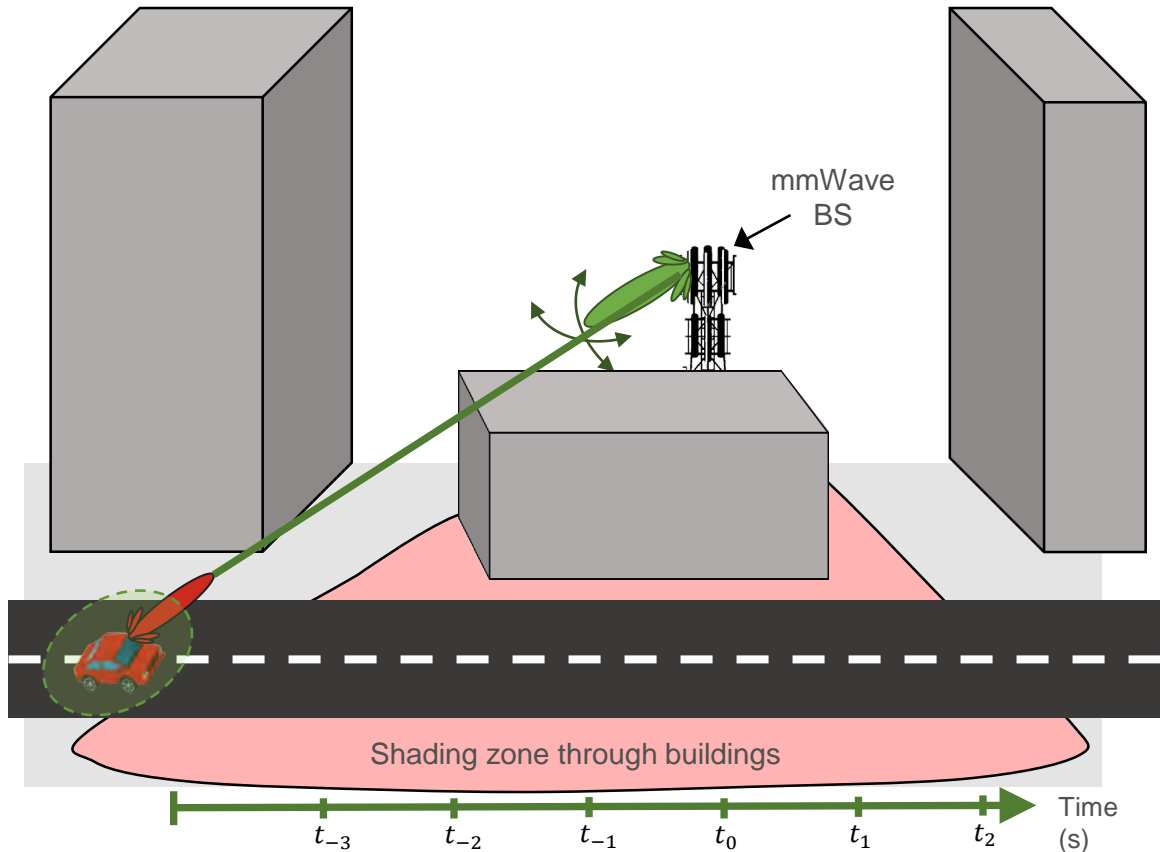
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# Programmable mmWave Radio Environments

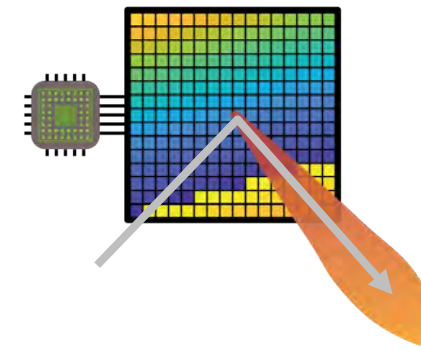
## Adding a new category of intelligent reflecting surfaces: HELIOS



Additional base station(s)



Reconfigurable Intelligent Surfaces (RIS)



NEW: Passive reflectors from additive manufacturing

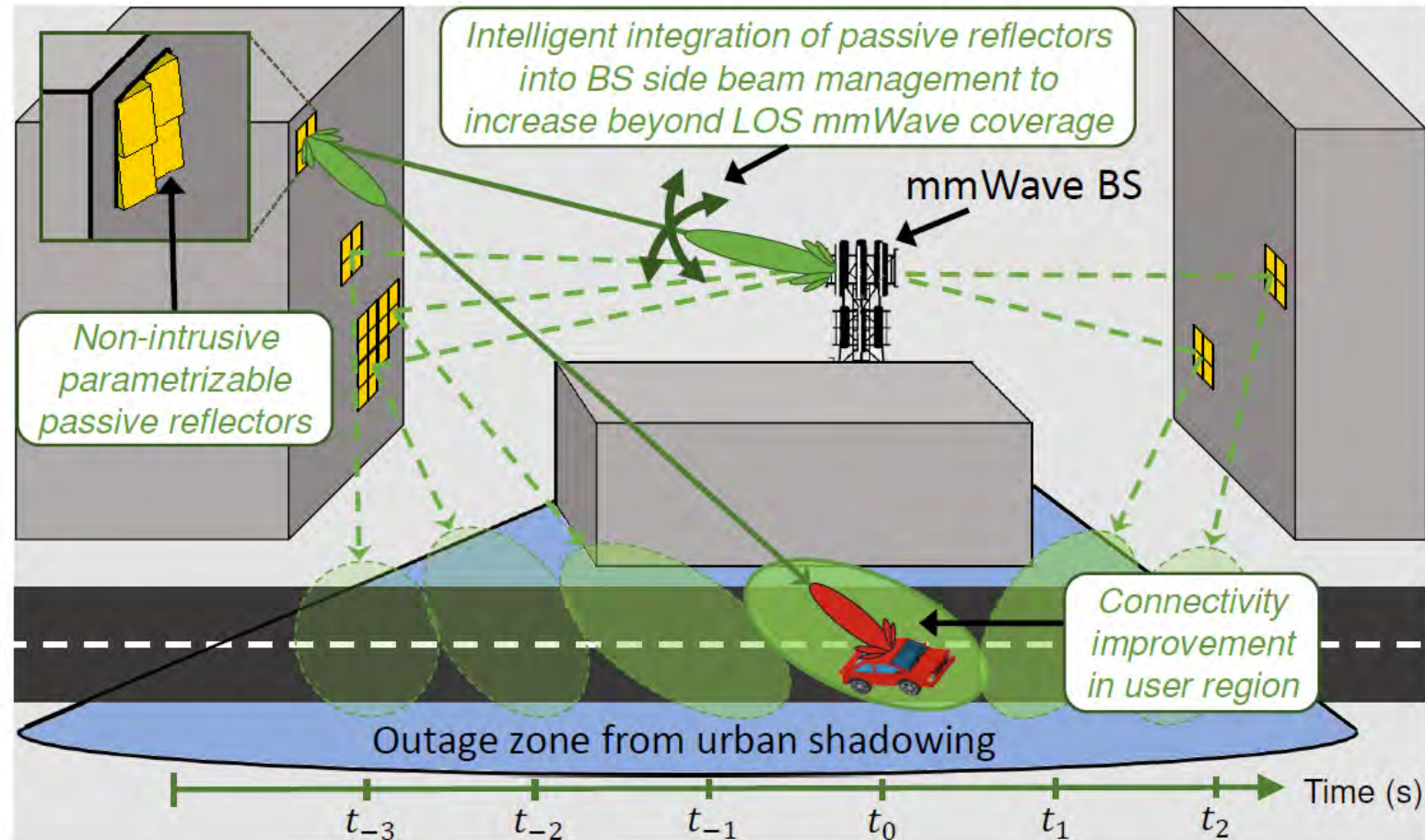
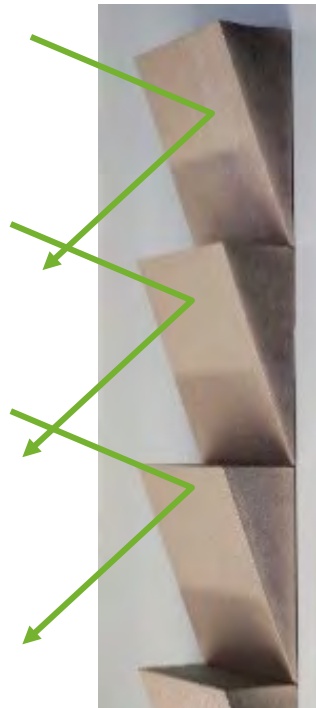


HELIOS

\*S. Häger, K. Heimann, S. Böcker, C. Wietfeld, "Holistic Enlightening of Blackspots with Passive Tailorable Reflecting Surfaces for Efficient Urban mmWave Networks," In IEEE Access, April 2023. [Online via [IEEE Xplore](https://ieeexplore.ieee.org/)].

# Programmable mmWave Radio Environments

## Adding a new category of intelligent reflecting surfaces: HELIOS

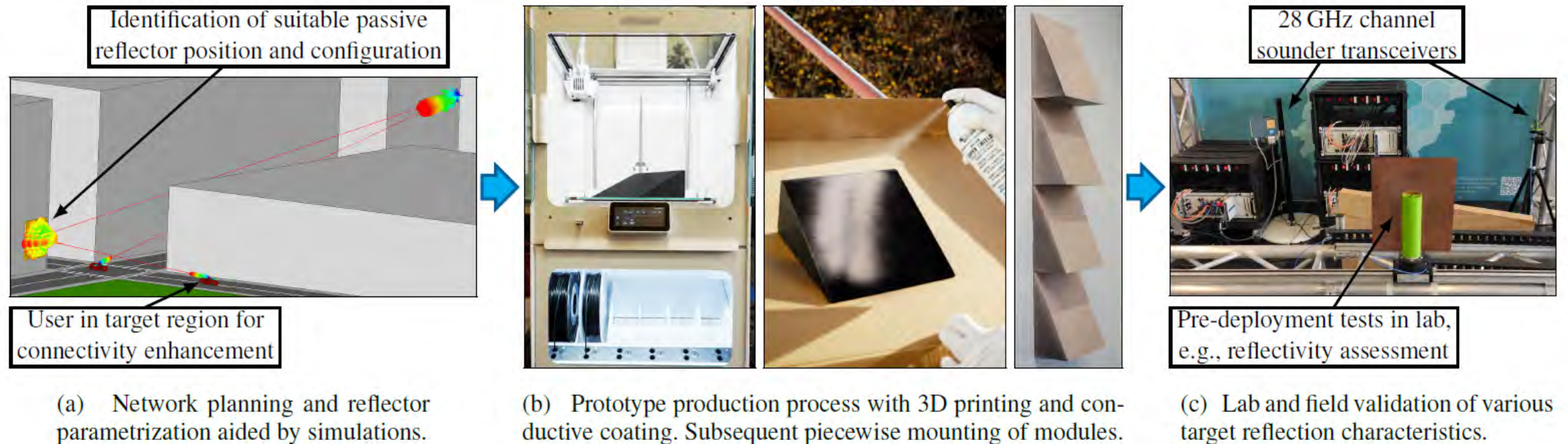


S. Häger, K. Heimann, S. Böcker, C. Wietfeld, "Holistic Enlightening of Blackspots with Passive Tailorable Reflecting Surfaces for Efficient Urban mmWave Networks," In IEEE Access, April 2023.

# Programmable mmWave Radio Environments

## Adding a new category of intelligent reflecting surfaces: HELIOS

### Tailored design and low cost production process



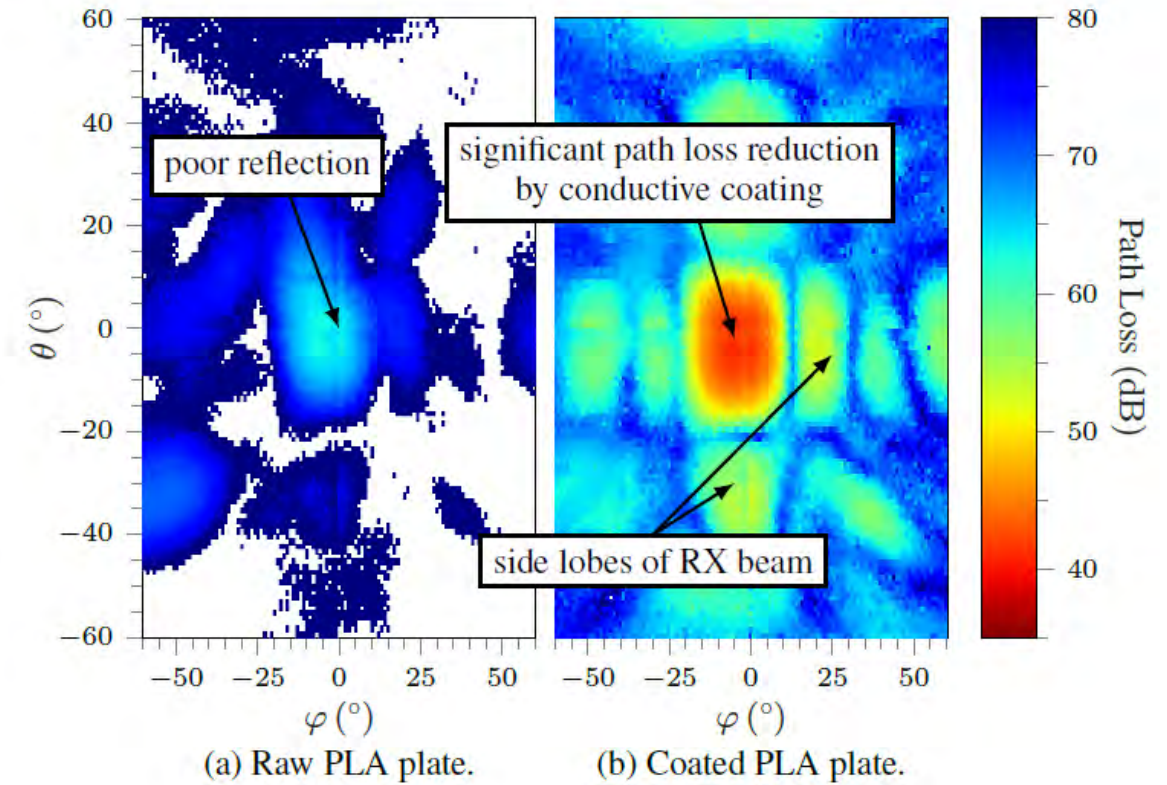
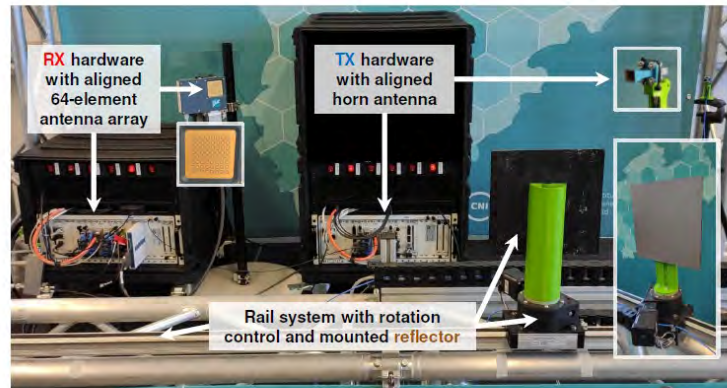
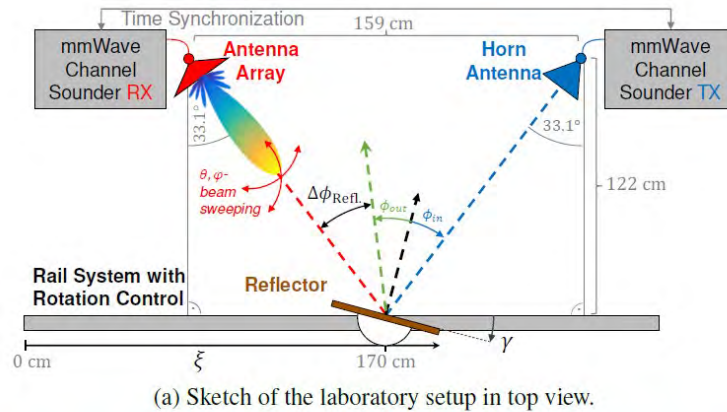
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# Programmable mmWave Radio Environments

## Adding a new category of intelligent reflecting surfaces: HELIOS

Feasibility of HELIOS reflectors confirmed in lab experiments

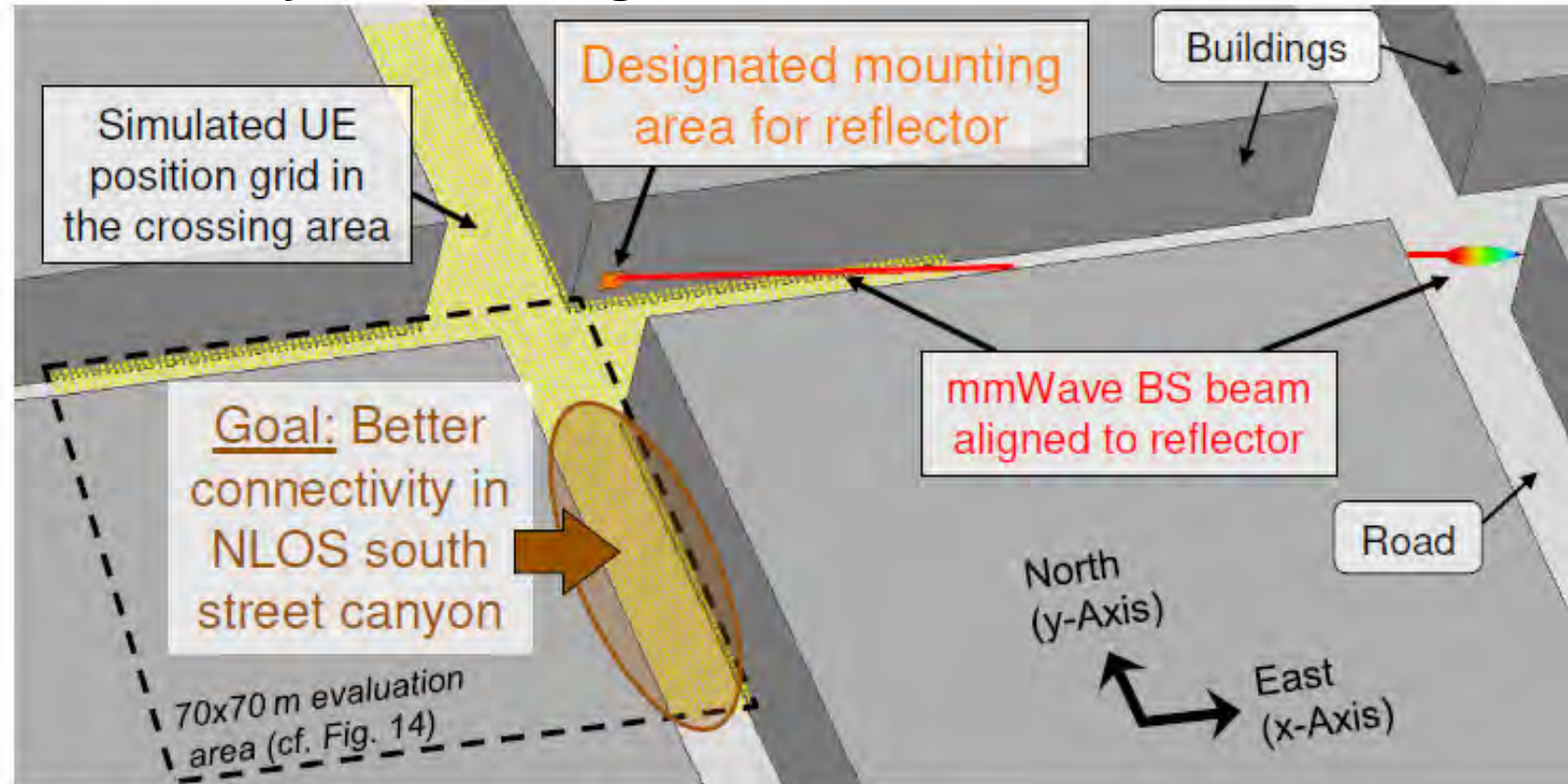


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## Programmable mmWave Radio Environments

# Adding a new category of intelligent reflecting surfaces: HELIOS

### Case study: illuminating a NLOS area

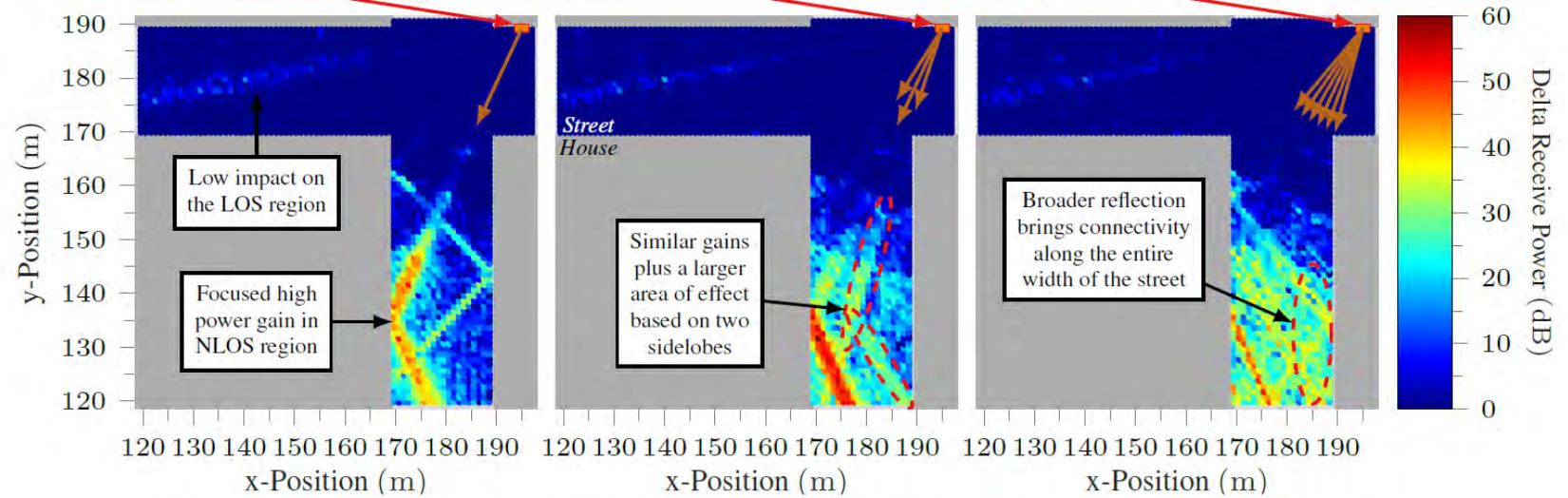
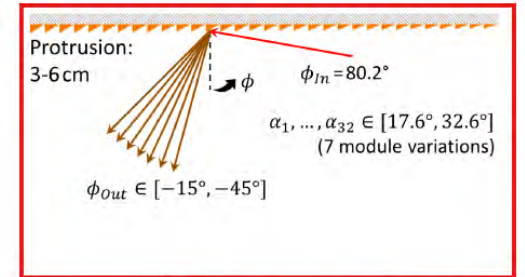
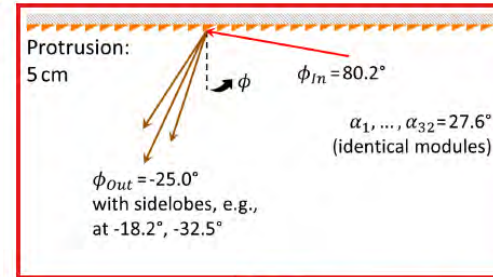
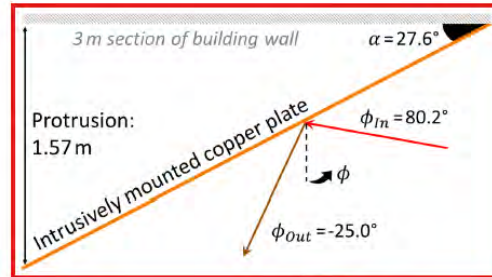
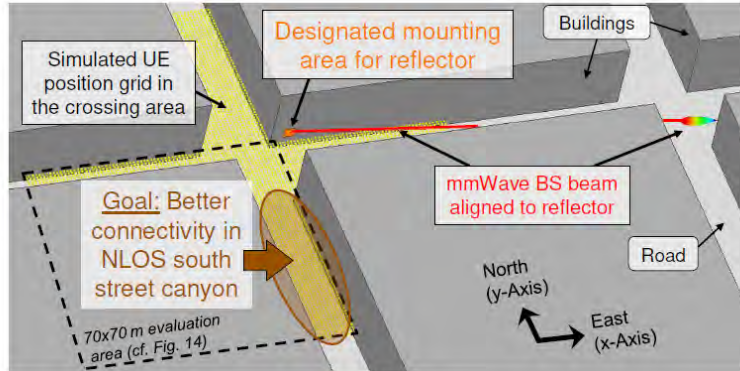


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# Programmable mmWave Radio Environments

## Adding a new category of intelligent reflecting surfaces: HELIOS

### Case study: illuminating a NLOS area



(a) Intrusively mounted copper plate. (b) HELIOS reflector (narrow beam). (c) HELIOS reflector (broad beam).

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# Programmable mmWave Radio Environments

***Much more research is needed to find the „right“ solutions to solve the NLOS problem of mmWave and even THz***



Metrics Categories/Features		Approaches Generic/Specific	Extra BS	Relay	Repeater	RIS/IRS		Passive Reflector		
						Active	Passive	Proposed HELIOS Concept	Mechanical Steerable Surface	Simple Plate/Foil
Power Consumption	Full Stack		●	○	○	○	○	○	○	
	Decoding/Channel Estimation		●	●	●	●	○	○	○	
	Amplification		●	●	●	●	○	○	○	
	Steering (Electronical or Mechanical)		●	●	●	●	○	●	○	
	Control Link		○	○	○	○	○	○	○	
Coverage Type	None/Passive		○	○	○	○	●	○	●	
	New Cell		●	○	○	○	○	○	○	
	Active Antennas		●	●	●	●	○	○	○	
	Generalized Snell's Law of Reflection [9]		○	○	○	○	○	○	○	
Signal Forwarding	Snell's Natural Law of Reflection		○	○	○	○	○	○	○	
	Full Stack		●	○	○	○	○	○	○	
	Decode & Forward		○	○	○	○	○	○	○	
	Amplify & Forward		○	○	○	○	○	○	○	
	Real-time Control of Reflection		○	○	○	○	○	○	○	
Control	None/Predefined		○	○	○	○	○	○	○	
	Backhaul (Wired or Wireless)		●	●	●	○	○	○	○	
	Control Signaling		○	○	○	○	○	○	○	
Material and Equipment	None/Predefined		○	○	○	○	○	○	○	
	Radio Unit (Transmit and/or Receive)		●	●	●	○	○	○	○	
	Active Antennas		●	●	●	○	○	○	○	
	Passive Antennas		○	○	○	○	○	○	○	
	Metamaterial		○	○	○	○	○	○	○	
	Tailorable Reflection		○	○	○	○	○	○	○	
Deployment	Reflective Material		○	○	○	○	○	○	○	
	Rooftop/Pole Mount		●	●	●	○	○	○	○	
	Wall/Ceiling Mount		○	○	○	○	○	○	○	
References			[10–12]	[12–18]	[14–18]	[6, 15–20]	[6, 14–19, 21, 22]	<i>This Work</i>	[6, 19, 22, 23]	[6, 18, 24–26]

Feature Classification: ● – Typical feature. ○ – Applies in selected realizations or system states. ○ – Does not apply.

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## Programmable mmWave Radio Environments

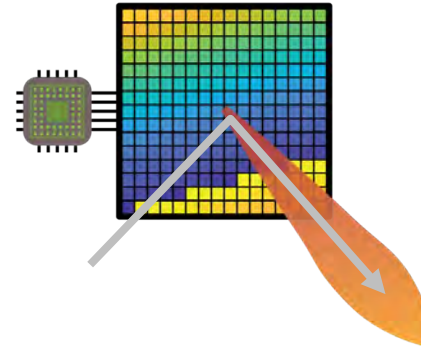
***Much more research is needed to find the „right“ solutions to solve the NLOS problem of mmWave and even THz***

### More base stations



- Full range of functions
- Largest capacity
- ➖ Complex installation (regulatory, technical)
- ➖ Comparatively high energy demand

### RIS



- Controllable features for flexible radio field extension
- Less effort in terms of installation and operation
- ➖ Electronic system with power and communication needs

### Passive HELIOS reflectors



- Cheaper manufacturing (additive)
- Self-sufficient (passive)
- Potential additional benefit
- ➖ Form factor: the more flexibility, the more modules are needed

## Summary

- The **solution space of wireless networking solutions gets ever more complex and multi-dimensional.**
- **Data-driven solution** supported by machine-learning delivers **deep insights in the performance of different solution and helps to make the proper choices.**
- Today's 6G-related networking research can go beyond mathematical modelling and simulation: **validation of selected networking concepts in the target environment** is enabled by **software-defined solutions** and **open interfaces**
- **Selected networking solution approaches** show their potential for resource-efficient support of highly reliable wireless communications: **STING, SAMUS, DraGon & HELIOS**



*Thank you very much for your attention!*



**Acknowledgement:** The work presented in the slides has been realized by the CNI team within various collaborative projects funded by DFG, BMBF, BMWi, BMVD, 5G.NRW. Special thanks go to Stefan Böcker, Fabian Kurtz, Dennis Overbeck, Robin Wiebusch, Caner Bektas, Melina Geis, Karsten Heimann, Simon Häger, Manuel Patchou, Christian Arendt, Hendrik Schippers, Tim Gebauer; Benjamin Sliwa.