



# Network Digital Twins

## Concepts, Requirements, and Applications

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GROUP **TECHNOLOGY**

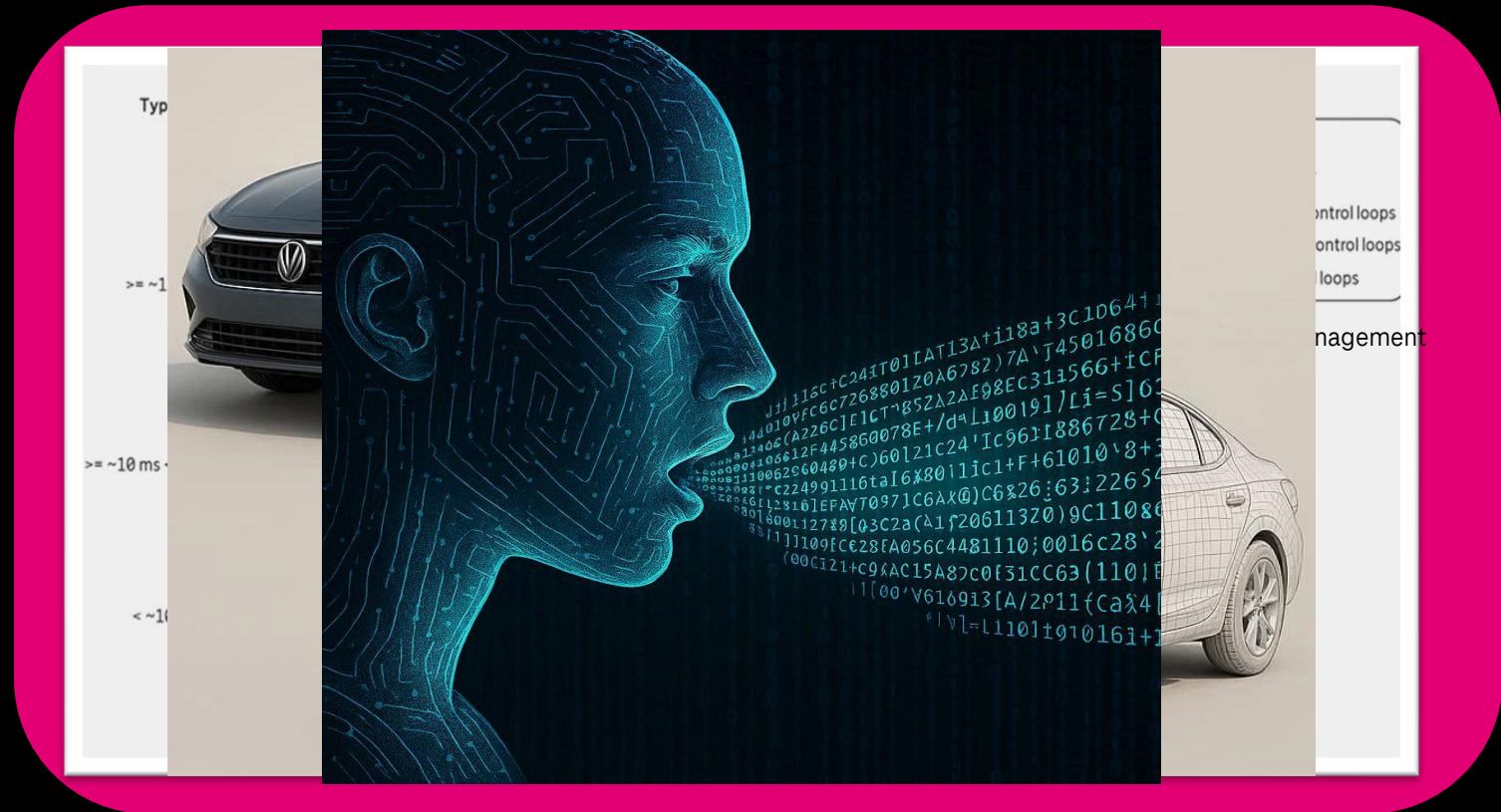


# (Network) Digital Twins – Short Introduction

- Future of telecommunication networks
- Exploring behavior of agents in the network

## → Digital Twin

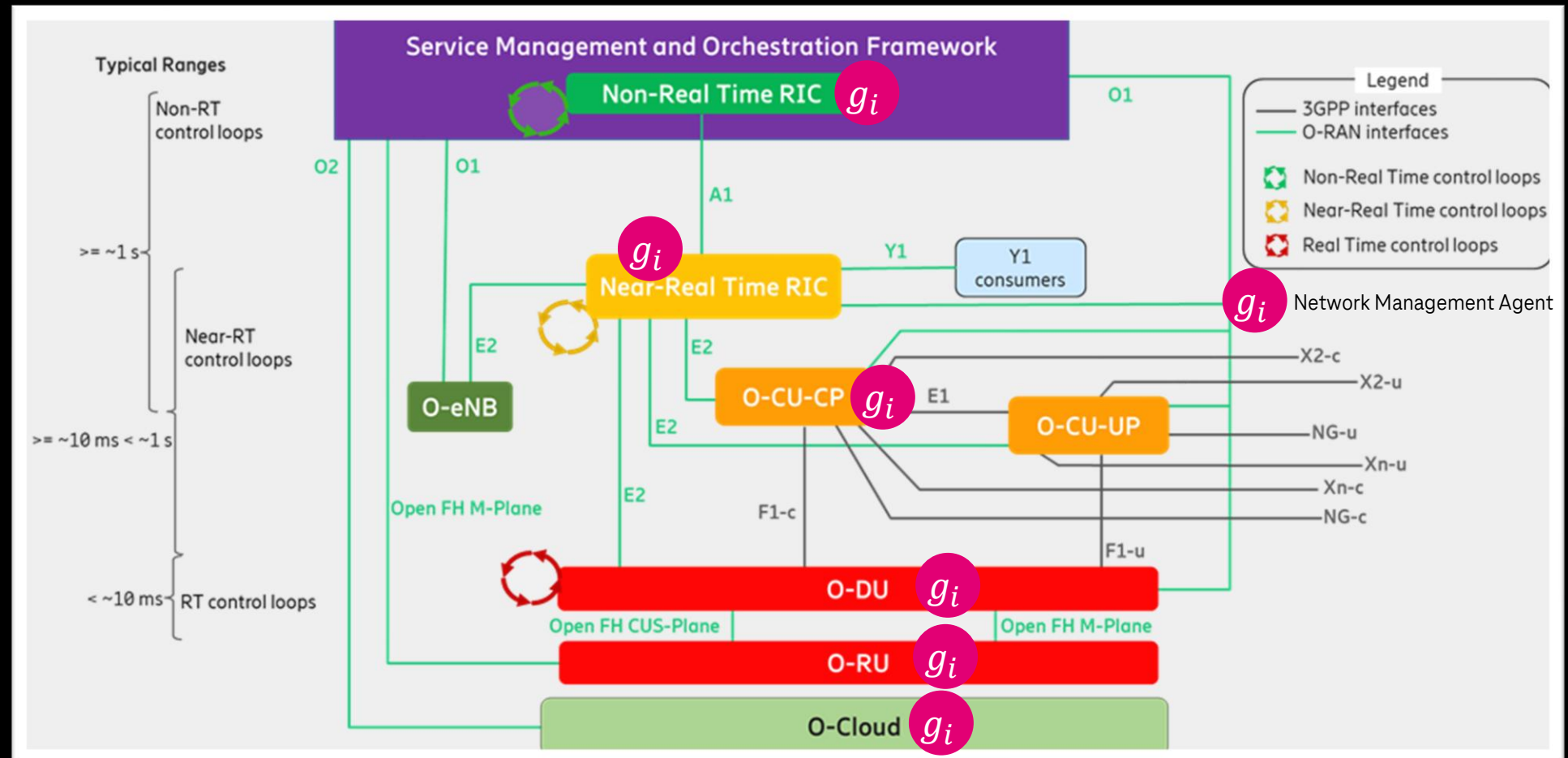
- Network Digital Twins
- Buzz word
- Planning tools, simulators
- What about a personal digital twin?



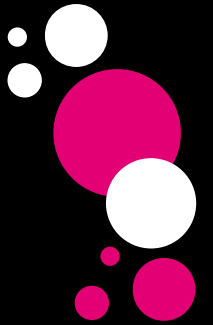
# Future Networks & Autonomy

- Heterogeneous agents  $g_i$
- Network (architecture & topology)
- Openness required
- Self-organization: synergies, oscillations, conflicts
- Operator policies {OP}

Can even be extended with agents in the UE and air interface (RIS).

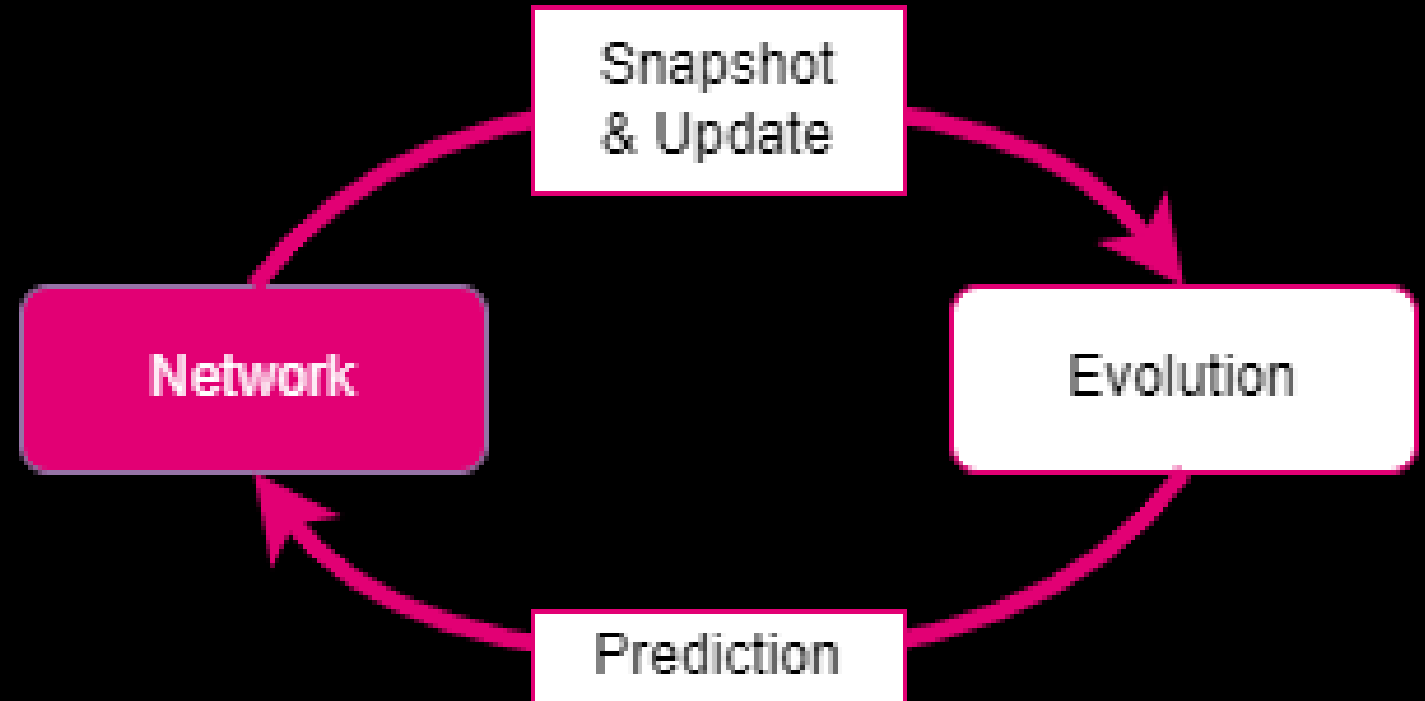


# Network Digital Twins – Core Properties

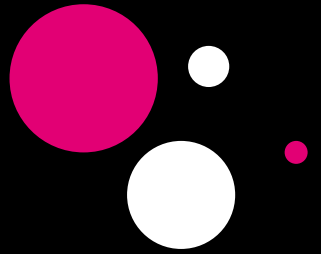


- **Network → Snapshot**
- **Propagation / Evolution engine**  
→ **Moving forward in time → Prediction**
- **Decision in the network**
- **Update engine / continuous coupling**

*Should be more resource efficient than an exact twin.*

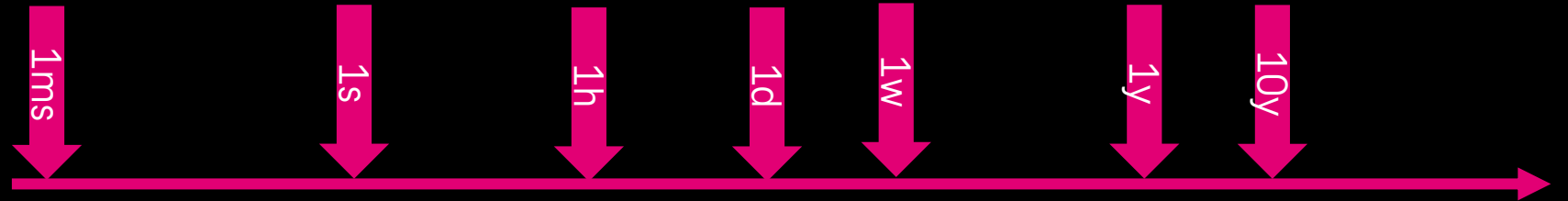


# Nothing is the network digital twin.



Scales in the network ( $10^{11}$ )

- Time
- Space
- ... and more



## Corollary

*A Network Digital Twin can never be a monolithic, “one size fits all” system.*

*It will be a modular system which provides the elements to be combined for answering **well-posed** questions.*

# Well-Posed Problems

## Objective:

- coverage, slicing, energy, ...
- plan, operate, optimize, ...

**Constraints:** architecture, resources, topology, service, ...

**Domains:** world, site, RAN, core, transport, E2E, ...

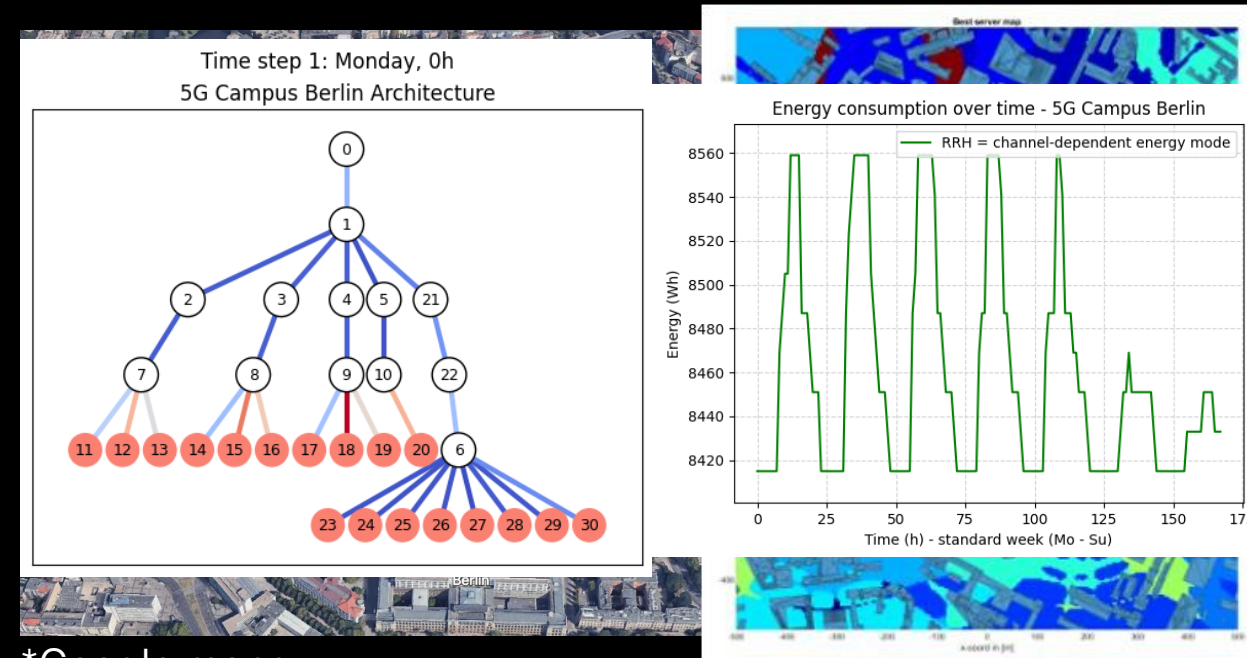
**Scales and resolution:** space, time, ...

→ Data & tools

→ Network Digital Twin

## Example

- Estimate load-dependent energy consumption



\*Google maps  
• Area, norm week

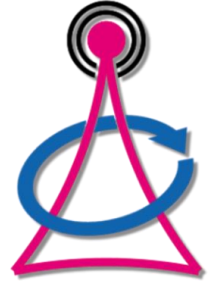
- Abstraction → architecture graph

→ Load distribution

→ Energy consumption

# Everything is a network digital twin.

- Emulators
- Simulators
- Planning tools
- Agents  $g_i$
- NOC



*Every function interacting with the network  
contains an expectation of how the network might react.*

*This could be considered a network digital twin.*

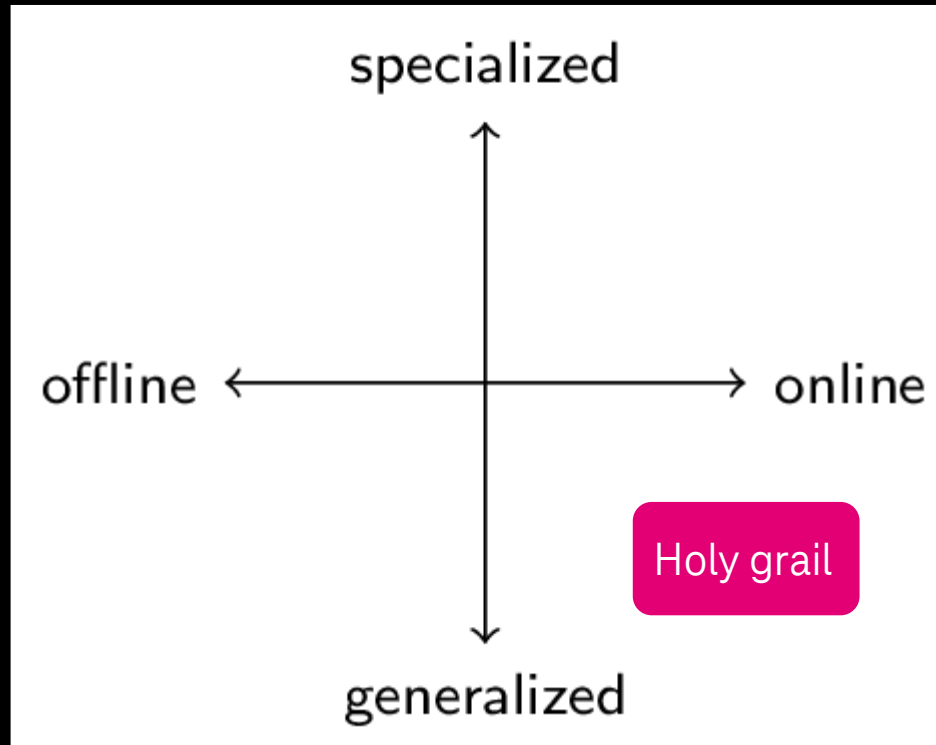
# NDTs – Classifications

- **Classification rather arbitrary**
- **Heuristic vs AI**

- What-if questions
- Detailed „heavy“ solutions

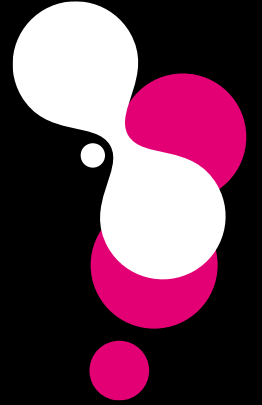
- **Similarities to foundation model**
- **What to do with all the twins?**

- Specific purpose
- Often implicitly contained



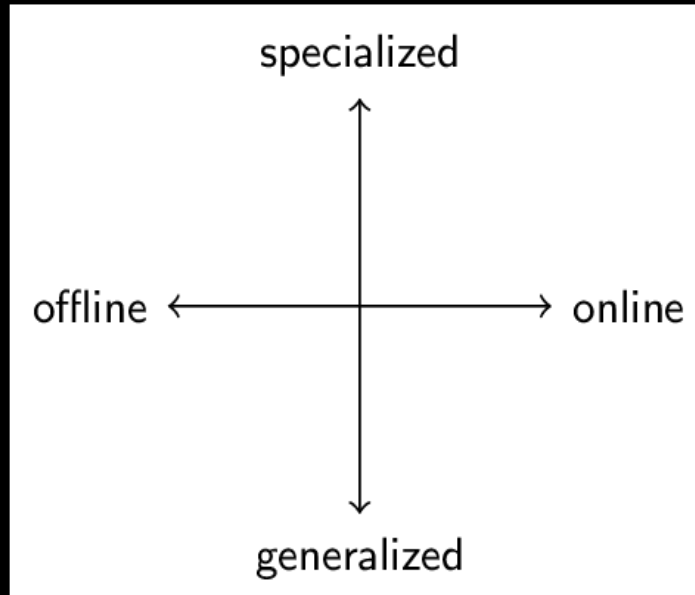
- Limited resources
- Run-time constraints

- Where to abstract?
- Not use case specific

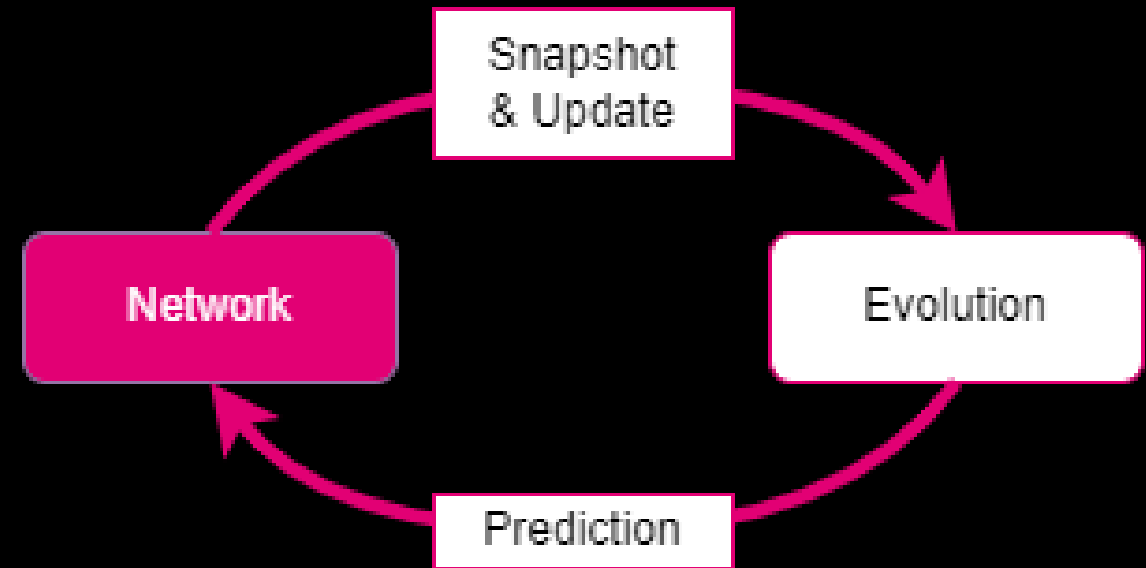




# NDTs – Further aspects & Requirements



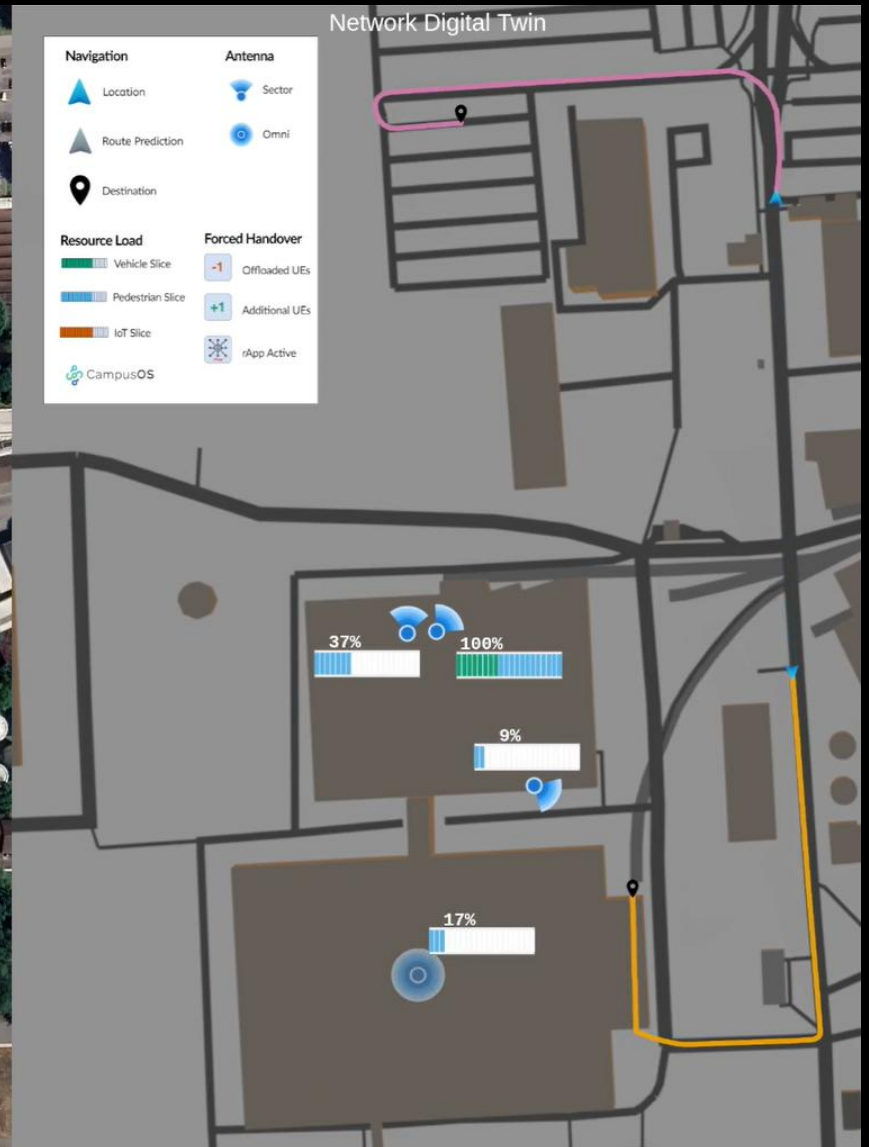
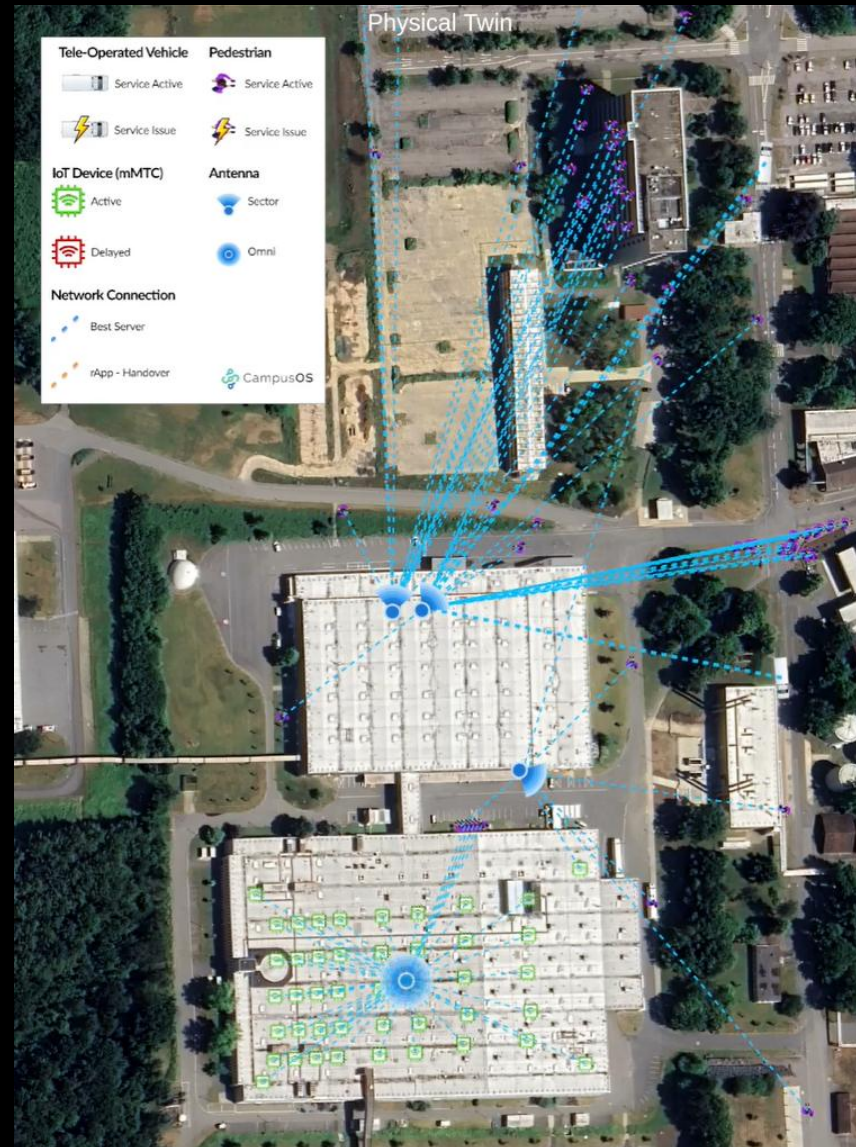
- **Modular system**
- **Multilevel simulation**
- **Abstraction**



- **Data:** quality, quantity, scenario generation
- **Calibration**
- **Correction**
- **Error analysis:** uncertainty quantification, error propagation, statistical bounds

# Pre-emptive handover

- **Private network**
  - Bosch Hildesheim
  - CampusOS
- **Priority Users**
- **Live data**
- **Enrichment information**
- **Open interfaces**
- **Prediction**
- **Decision**



# Location assignment

Determine the optimal location for functionalities  
under performance constraints.

$$\begin{aligned}
 \min \quad & \text{cost}(L) \\
 \text{s.t.} \quad & \text{resource}(L) \leq \text{res. bounds} \\
 & \text{latency}(L) \leq \text{lat. bounds} \\
 & \text{traffic}(L) \leq \text{capacity} \\
 & \text{more constraints}
 \end{aligned}$$

Offline or online

Mathematical  
modelling

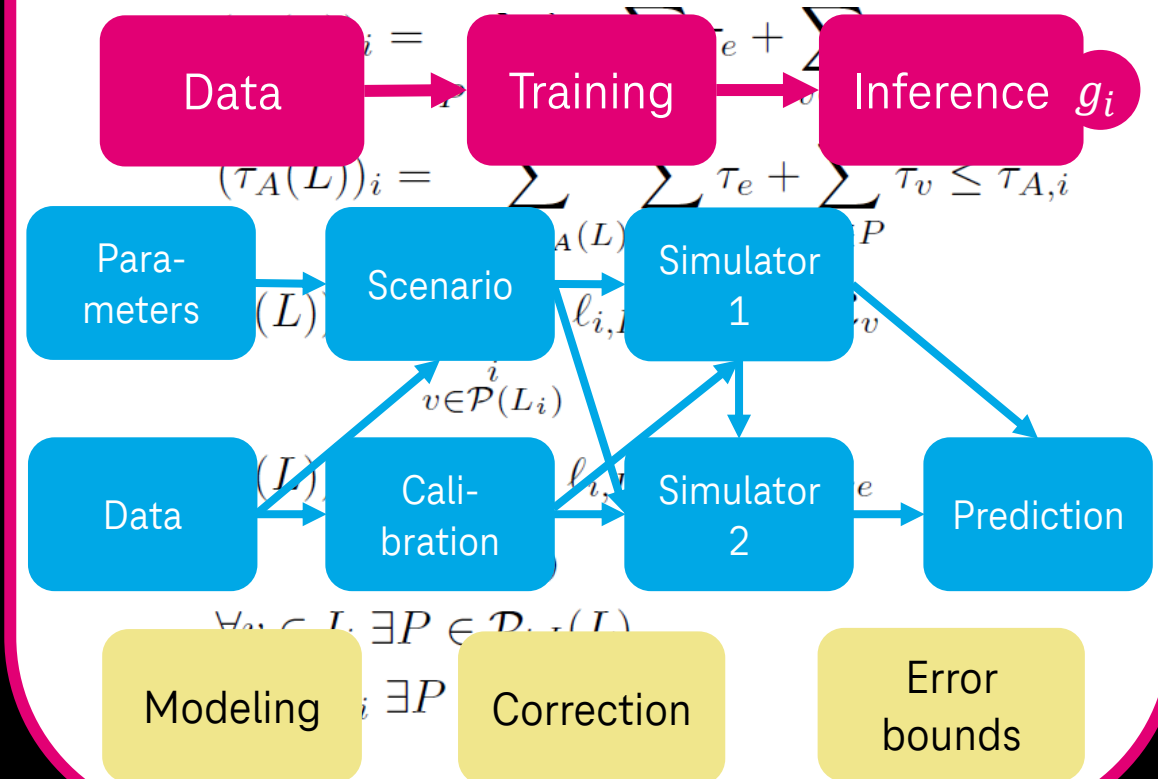
Simulators

AI

$g_i$

Hybrid

$$\begin{aligned}
 \min_L \quad & \alpha \|\rho(L)\| + \beta \text{Sim}(L) + \gamma g_i(L) \\
 \text{s.t.} \quad & g_i(L) \leq B_i \quad \text{PI bounds}
 \end{aligned}$$



# NDTs & Conflict Resolution

Detection and mitigation is not good enough.

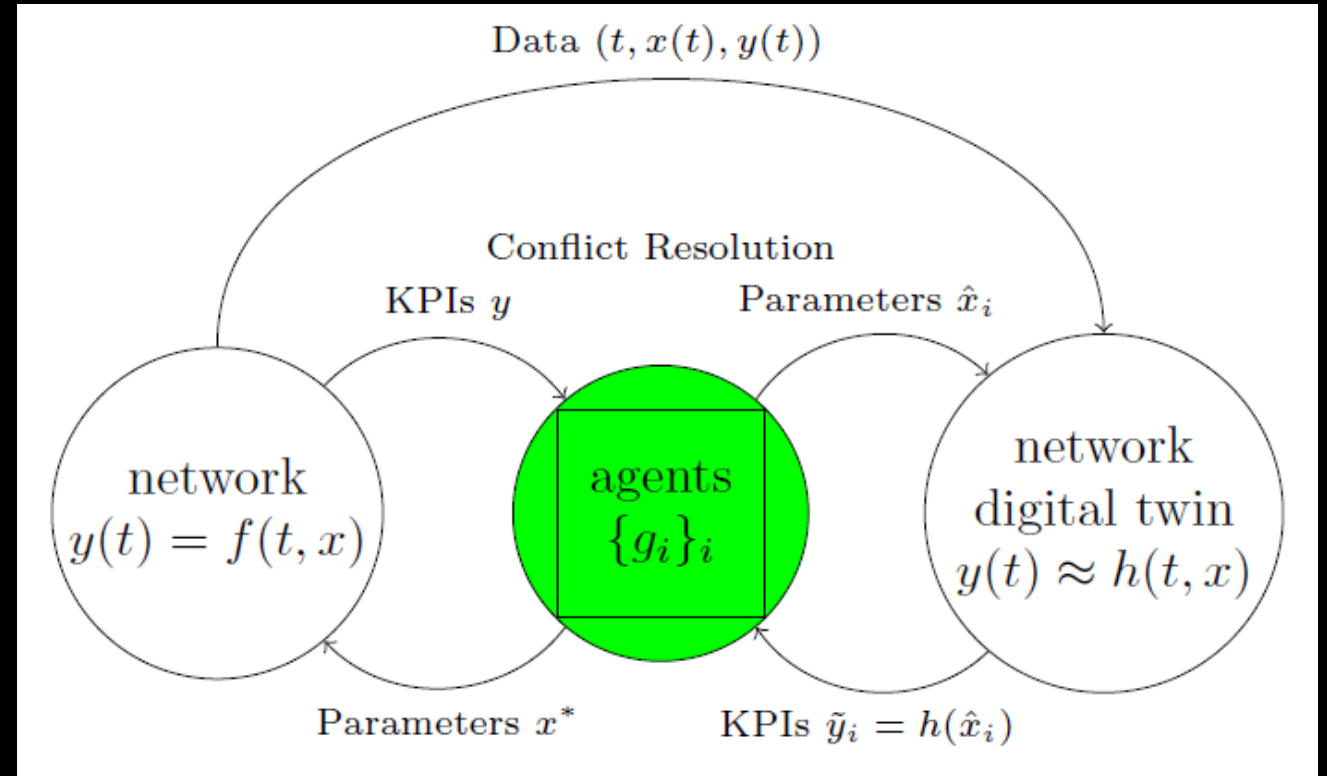
## Conflict Resolution

- Priority list
- Center of mass
- Mathematical optimization
- Agent consensus

## Chaotic dynamical system

Network digital twin enables sophisticated solutions.

Drift to harmony or encouraging extreme behavior?



$$\begin{aligned} \min \quad & \text{dist}(y, \{\text{OP}\}) \\ \text{s.t.} \quad & y = h(x^*) \\ & x^* = \sum_i \lambda_i \hat{x}_i \end{aligned}$$

The background features a large, vibrant pink circle on the right side. On the left, there is a black area containing several overlapping circles in white and pink. A large white circle is partially visible on the far left. A smaller pink circle is positioned above a larger pink circle. Inside the larger pink circle, there are three white circles of varying sizes. The text "Thank you for your attention." is centered within the pink area on the right.

**Thank you**  
for your attention.