

# The Feasibility of Dense Indoor LoRaWAN Towards Passively Sensing Human Presence

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<sup>2</sup>Miami University, Oxford, OH, USA

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<sup>4</sup>Bond University, Robina, Australia



Presentation available here: [10.5281/zenodo.4605350](https://zenodo.org/record/4605350)

Good morning, my name is Jascha Grübel and I am a PhD student at ETH Zürich and today I will present our work “the feasibility of dense indoor LoRaWAN towards passively sensing human presence”. [NS]

# Can we obtain spatial human presence passively from environmental sensor data *indoors*?

[1] Laput, Gierad, and Chris Harrison. "Exploring the efficacy of sparse, general-purpose sensor constellations for wide-area activity sensing." *Proceedings of the ACM on Interactive, Mobile, Wearable and Ubiquitous Technologies* 3.2 (2019): 1-19.  
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[C] Previous work on human presence has mostly focused on room-level setups.

[C] A single sensor device is installed to measure different forms of presence.

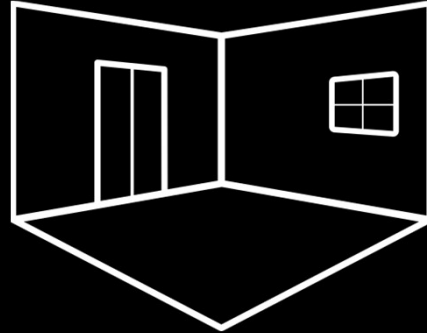
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# Can we obtain spatial human presence passively from environmental sensor data *indoors*?

- Previous work on human presence



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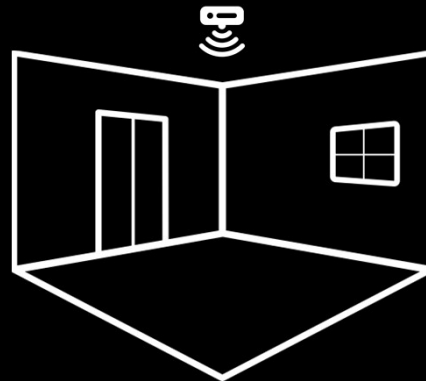
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- Previous work on human presence
  - One sensor per room [1-2]



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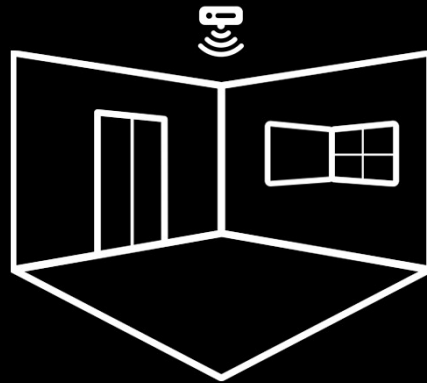
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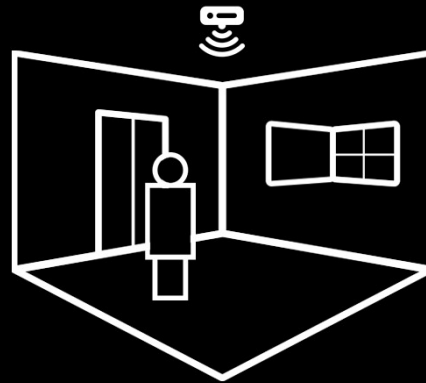
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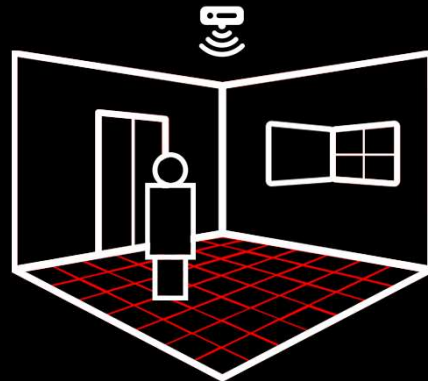
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Produce a Dense Indoor Sensor Network (DISN)

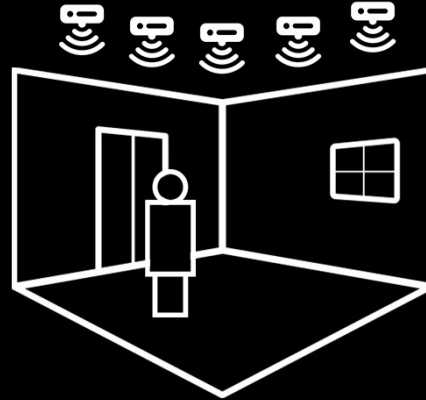


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To get spatial measures we need to produce a dense indoor sensor network or D.I.S.N.

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[C] First, how feasible is this technologically.

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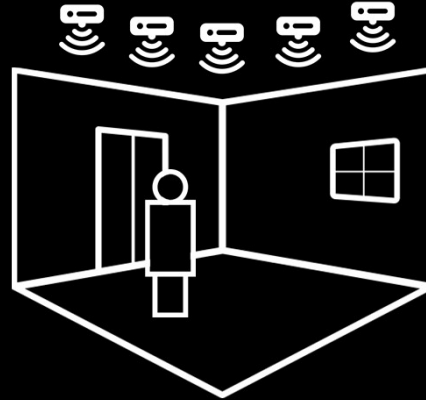


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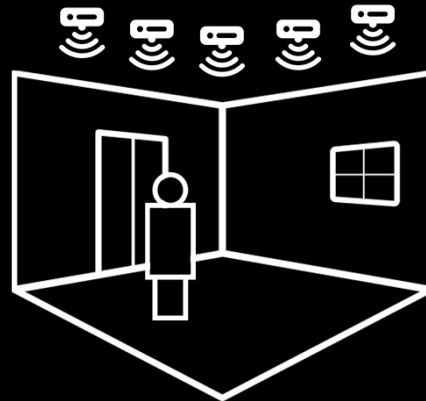


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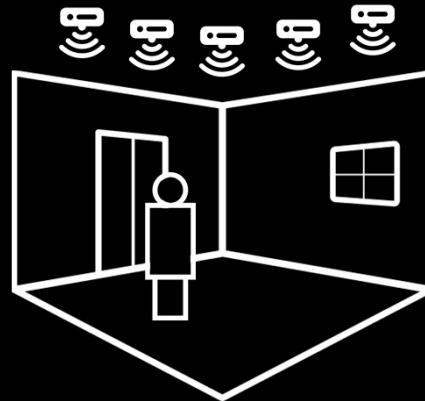


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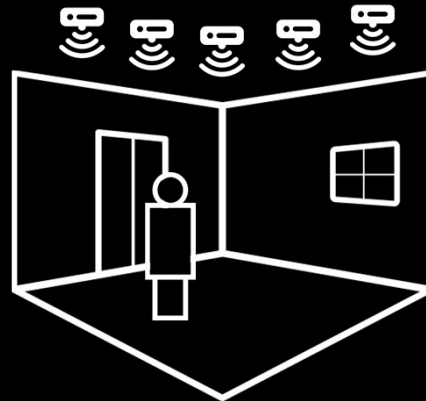


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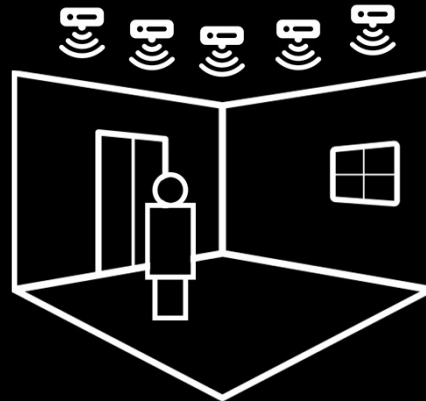


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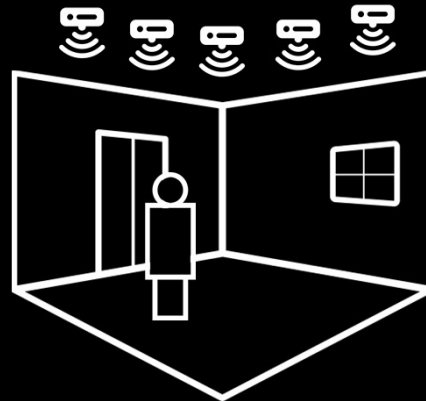


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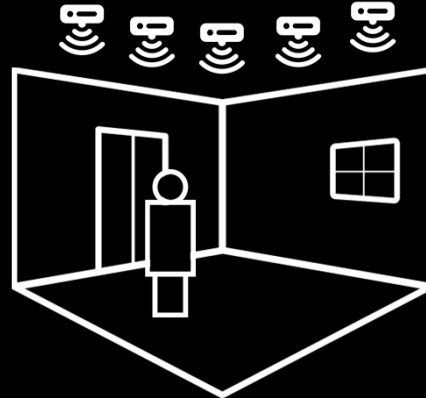


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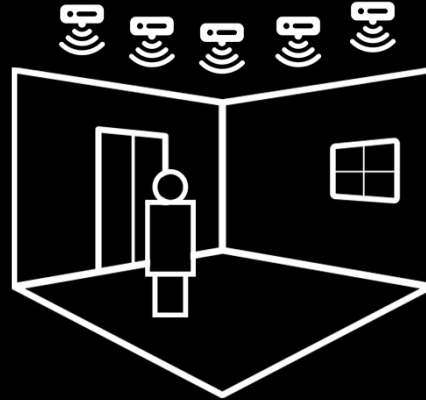


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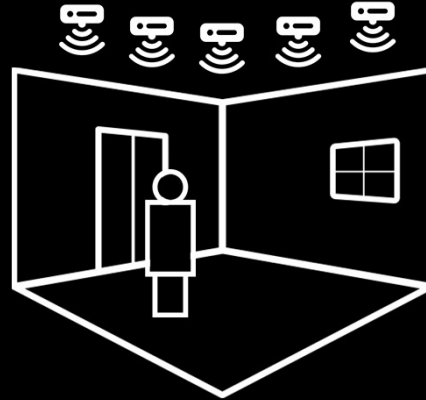


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# Low Power Wide Area Networks (LPWAN)

## A natural choice *outdoors*

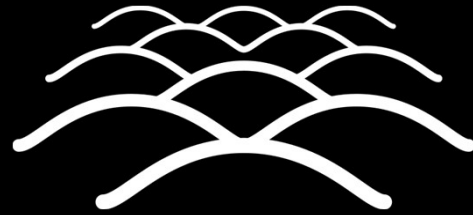


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The Feasibility of Dense Indoor LoRaWAN Towards Passively Sensing Human Presence – Jascha Grubel

15.03.2021 5.1

Low Power Wide Area Networks (or LPWAN) are a natural choice in outdoor scenarios.

[C] An access point is used to wirelessly connect devices across large distances.

[C] They can handle devices with low accessibility such as in forests, underground or distributed in cities.

[C] Furthermore, they can work even with limited maintenance because of the robust design.

[C] Usually they require very little power for transmission and therefore can run without external energy supply for years on batteries.

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## Low Power Wide Area Networks (LPWAN) A natural choice *outdoors*

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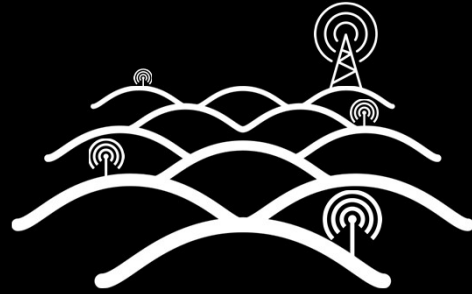


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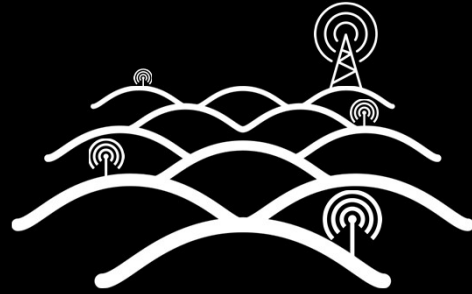


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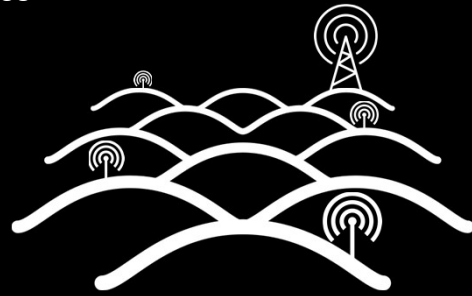


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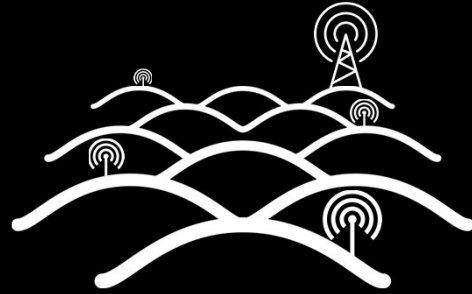
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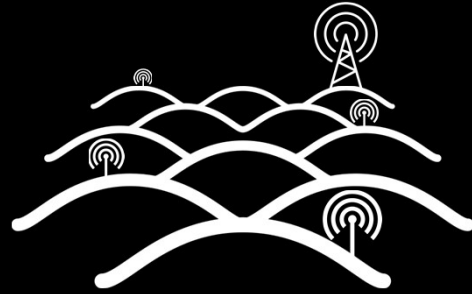


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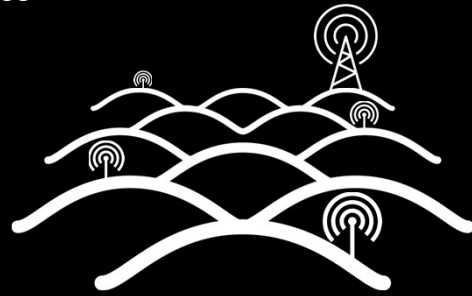


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15.03.2021 5.7

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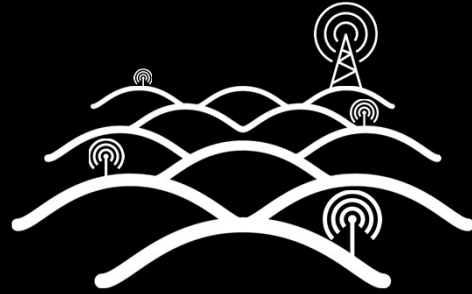


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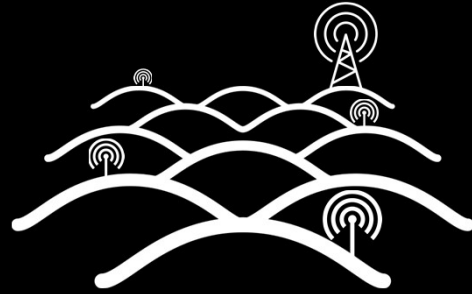
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**This is very useful *indoors* as well!**

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[C] They can handle devices with low accessibility such as in forests, underground or distributed in cities.

[C] Furthermore, they can work even with limited maintenance because of the robust design.

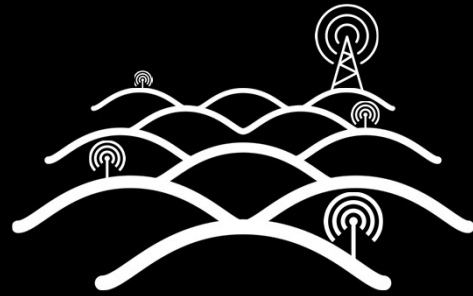
[C] Usually they require very little power for transmission and therefore can run without external energy supply for years on batteries.

[C] Environmental sensor data is usually tiny and does not require large bandwidth, so limited bandwidth poses no issue.

[C] Interestingly, these characteristics are also very useful for indoor applications.

# Long Range Wide Area Network (LoRaWAN)

## The most common standard



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Figure composition created by Jascha Grübel based on creative commons vector graphics from the Noun Project by users emilegraphics, Megan Chown, Tami Nova (DE), ProSymbols (US), Muhammad Ridho (ID)

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15.03.2021

6.1

Amongst LPWAN implementations the Long Range Wide Area Network (or LoRaWAN) is the most commonly used standard exemplified by the rise of The Things Network.

LoRaWAN offers three advantages:

[C] It is an open standard backed by the industry-based LoRaWAN Alliance with

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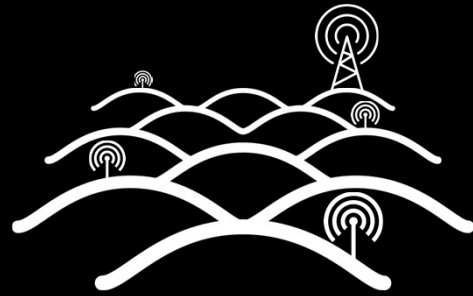
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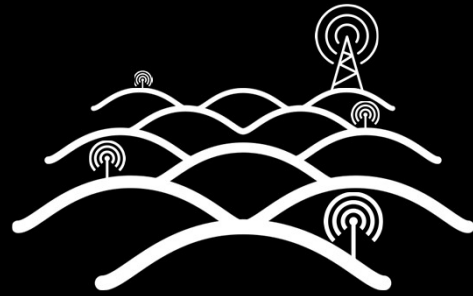
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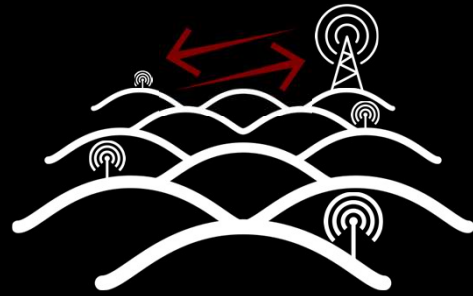


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15.03.2021 6.4

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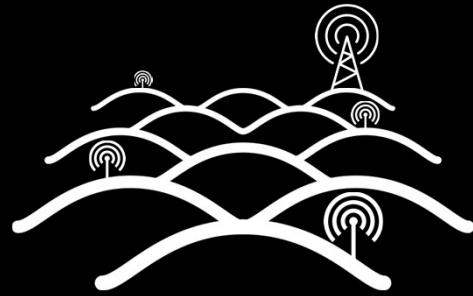


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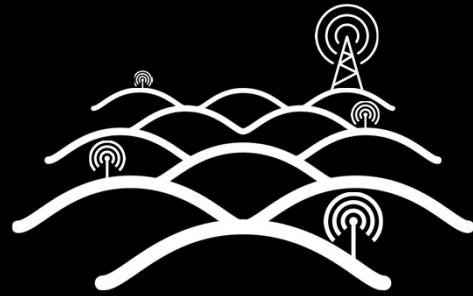


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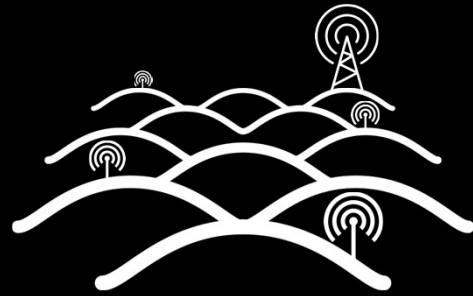


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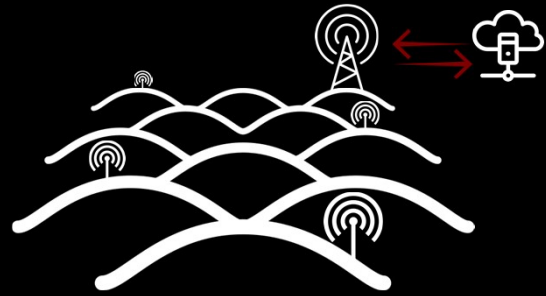


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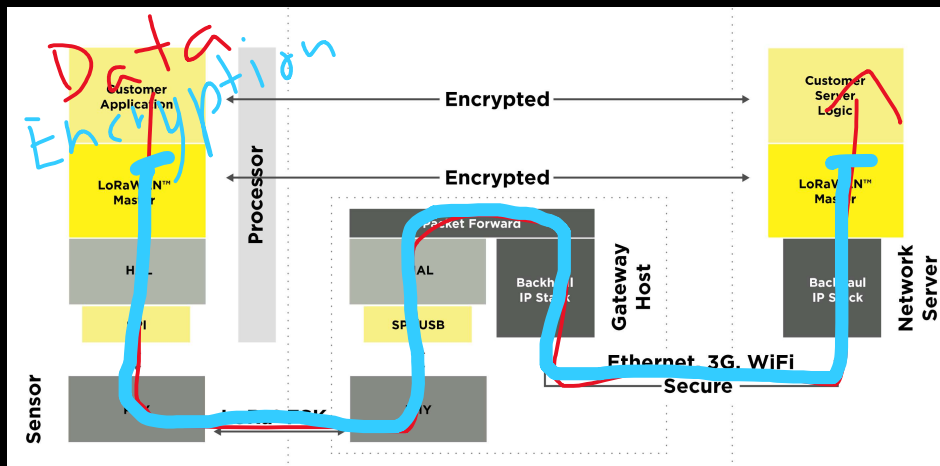
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# LoRaWAN And LoRa

Before we dive into our implementation, let me give you a quick recap of LoRaWAN and LoRa. Many of you may be experts but I would like to take everybody along.

## The LoRaWAN Protocol [4] on Top of LoRa



[4] The LoRa Alliance. "About LoRaWAN" <https://loro-alliance.org/about/lorawan/> (2018).

[5] Abramson, Norman. "The ALOHA system: Another alternative for computer communications." *Proceedings of the November 17-19, 1970, fall joint computer conference*. 1970.

In the LoRaWAN protocol,

[C] the encrypted data from a sensor device flows to some remote application on a server.

The device uses a LoRa transceiver to send a message to the gateway.

The gateway transforms the message to the Internet Protocol (IP) to send it to the network server.

[C] The transmission is also encrypted on a second level.

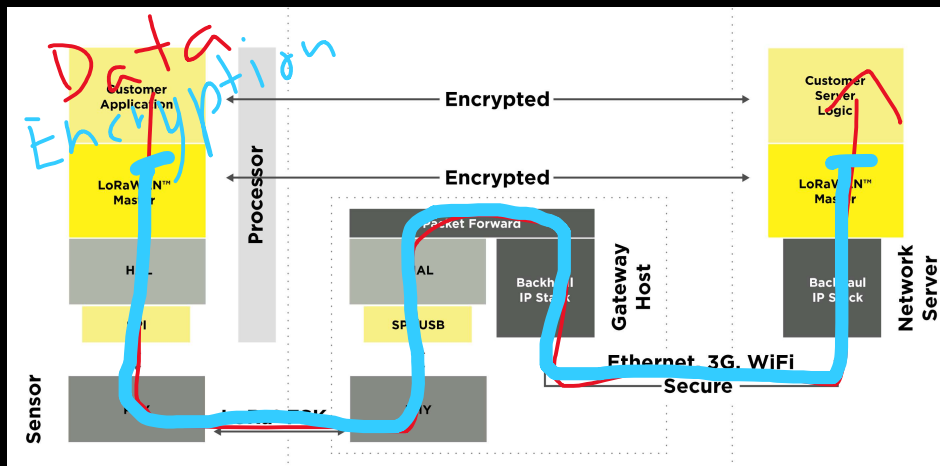
The payload is encrypted between device and network server enabling a separation between transmission and content underpinning services such as The Things Network.

[C] Most commonly, LoRaWAN class A devices are used.

To conserve the most energy possible, they have an ALOHA-like receive time window after every transmission. That means the device can sleep most of the time and only expects transmission in these selected time windows.



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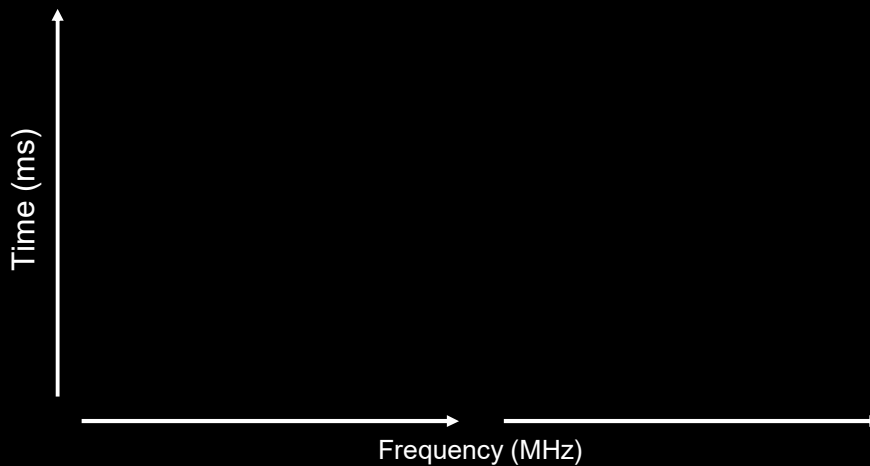
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## LoRa Chirp Spread Spectrum Modulation



ETH zürich

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15.03.2021 9.1

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[C] a lower to higher frequency or  
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This chirp produces robustness because of its duration and pattern.

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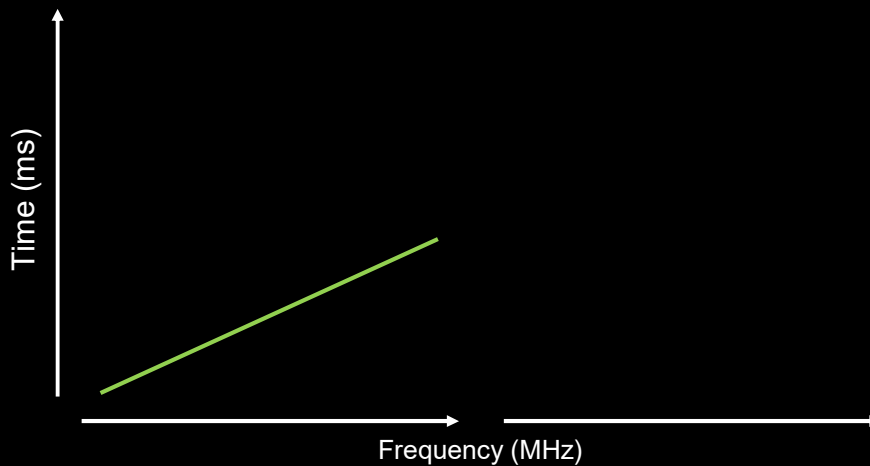
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Generally, the larger distance, the higher the required SF must be to

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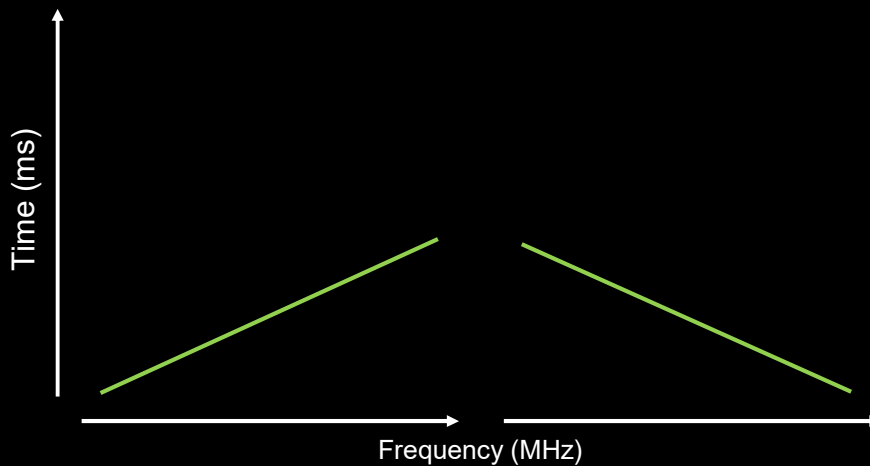
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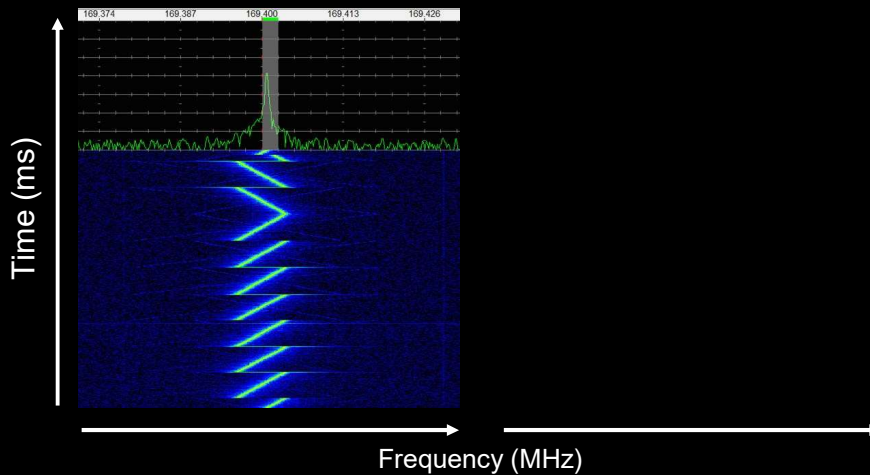
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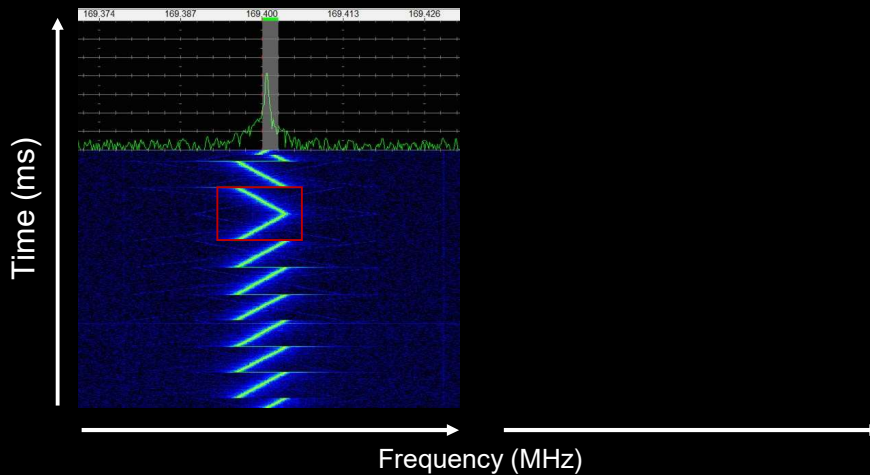
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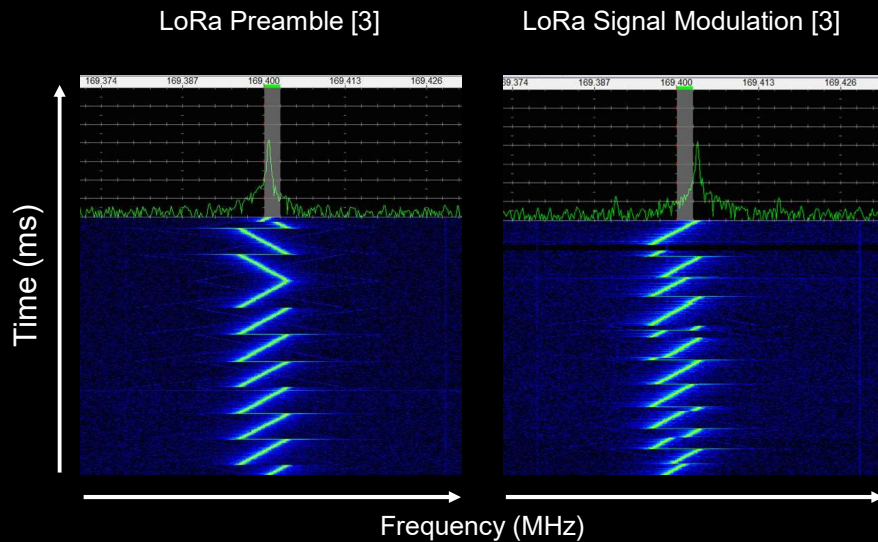
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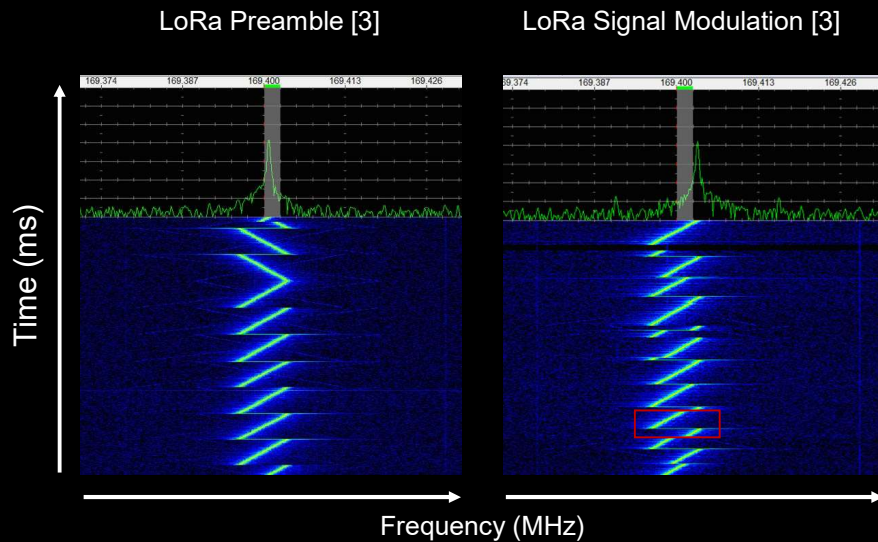
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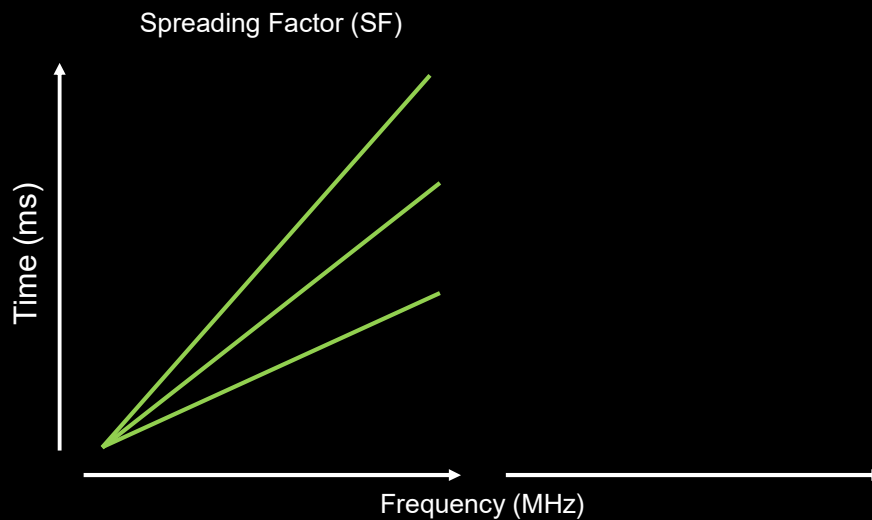
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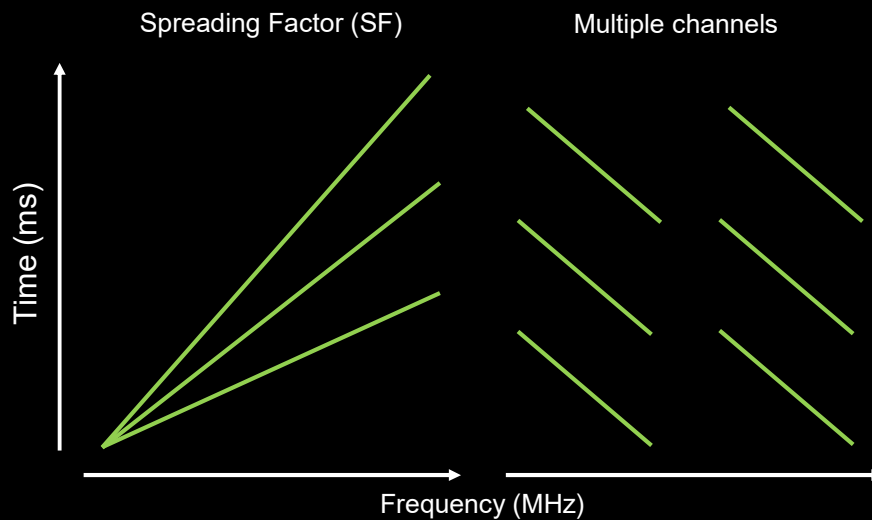
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[C] vice versa.

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[C] To start communication, the preamble is sent. This allows listening devices to record the signal [C] after the inverted chirp.

[C] The symbols are encoded by modulation.

[C] One symbol still consists of a chirp but the starting point is cyclically shifted.

[C] The spreading factor defines the time that a chirp requires and indirectly the data rate that can be achieved.

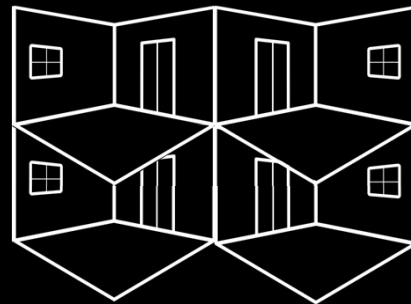
This entails multiple trade-offs between the data rate (how much we can send), the integration time (here a longer signal is better) and the number of transmissions (here a shorter signal is better).

[C] Using multiple channels, i.e. base frequencies and multiple spreading factors (i.e. chirp durations) allows for robust concurrent transmission of messages because each chirp can be uniquely identified as long as they do not occur on the same channel at the same spreading factor and time.

Generally, the larger distance, the higher the required SF must be to

reconstruct the signal.

## LoRaWAN application indoors are limited to small scale studies and simulations



[6] E. D. Aylele, C. Hakkenberg, J. P. Meijers, K. Zhang, N. Meratnia, and P. J. Havinga, "Performance analysis of lora radio for an indoor iot applications," in *2017 Int. Conf. Internet of Things for the Global Community (IoTGC)*. New York: IEEE, 2017. ... [See paper and references for full list]

[14] T. Wendi, F. Volk, and E. Mackensen, "A benchmark survey of long range (lora) spread-spectrum-communication at 2.45 ghz for safety applications," in *16th IEEE Annu. Wireless and Microw. Technol. Conf. (WAMICON)*. New York: IEEE, 2015.

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ETH zürich

The Feasibility of Dense Indoor LoRaWAN Towards Passively Sensing Human Presence – Jascha Grübel

15.03.2021 10.1

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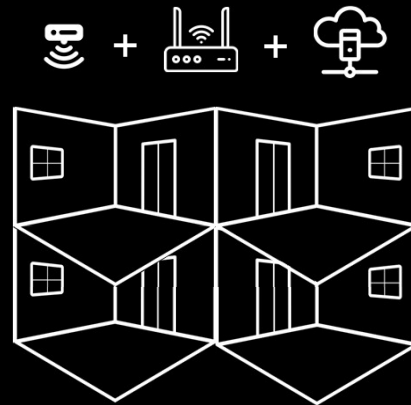
[C] often moving the device around to get different measurements.

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- Minimal viable design (one device, one gateway, one network server) [6-14]



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## LoRaWAN application indoors are limited to small scale studies and simulations

- Minimal viable design (one device, one gateway, one network server) [6-14]
  - Single device at multiple locations



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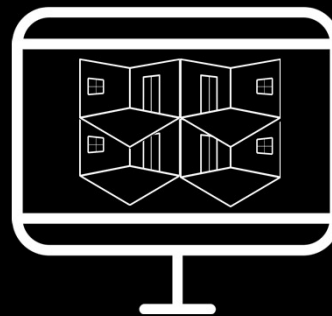
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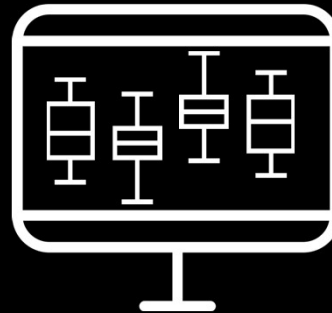
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- Minimal viable design (one device, one gateway, one network server) [6-14]
  - Single device at multiple locations
- Hundreds of devices or multiple gateways only in simulations
- Descriptive statistics based on low number of transmissions



[6] E. D. Ayala, C. Hakkenberg, J. P. Meijers, K. Zhang, N. Meratnia, and P. J. Havinga, "Performance analysis of lora radio for an indoor iot applications," in 2017 Int. Conf. Internet of Things for the Global Community (IoTGC). New York: IEEE, 2017. ... [See paper and references for full list]

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# Implementation And System Design

We wanted to design and implement a real dense indoor sensor network that goes beyond simulations to test what happens in the real world.

## Our DISN prototype at ETH Zürich

- [C] Let me start by giving you an overview of the key data of our system.
- [C] We setup our DISN in an office building at ETH Zürich.
- [C] We installed 390 sensors and
- [C] 3 gateways across
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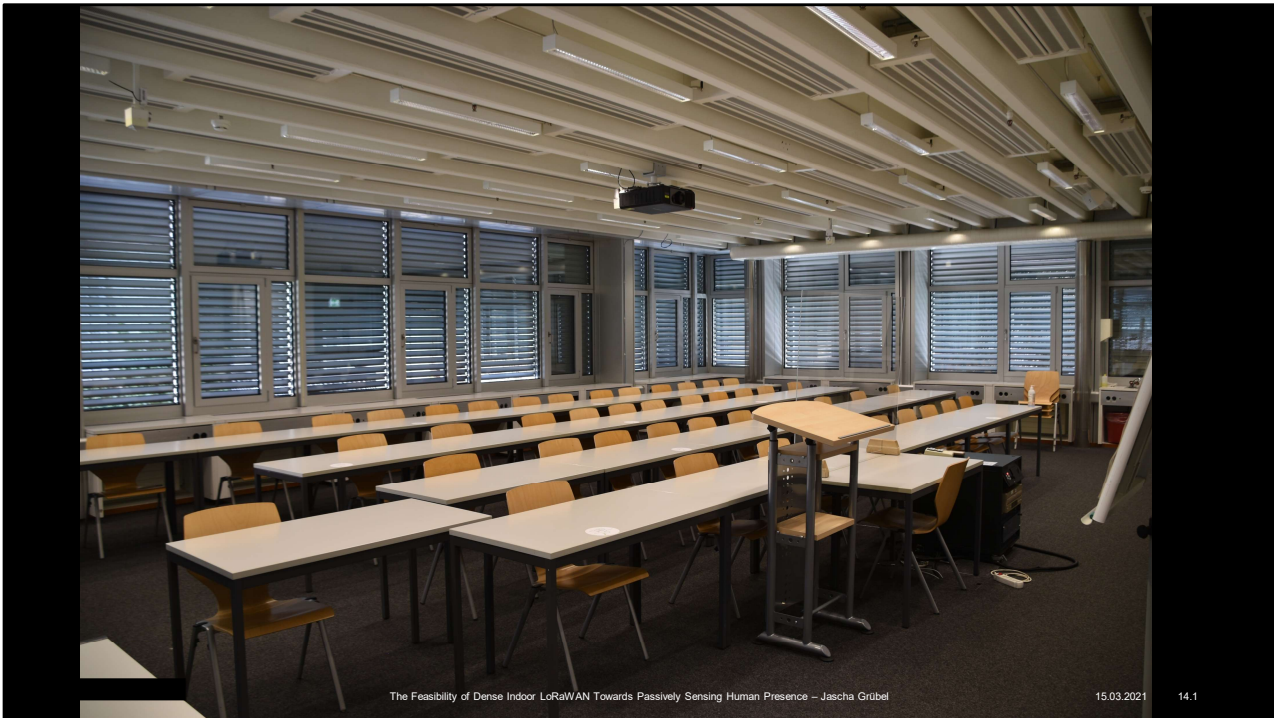
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# Walkthrough

Let me first give a walkthrough the building, setup and implementation.



We start in a lecture hall in the building.

[C] 5 types of LoRaWAN sensors are placed out of sight in all public spaces of the building.

[C] We chose the types based on their ability to indicate human presence.

Previous research has connected

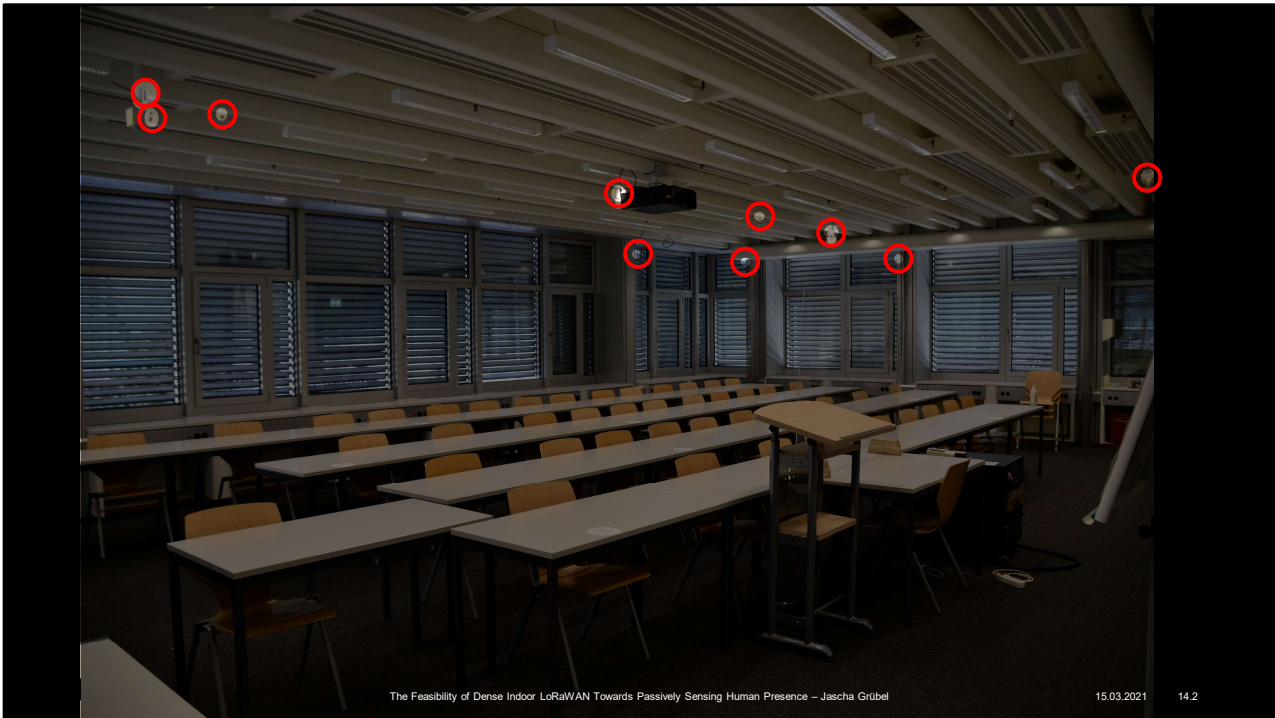
[C] levels of CO<sub>2</sub>,

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[C] We transition to virtual representation of the lecture hall in the digital twin.

[NS]



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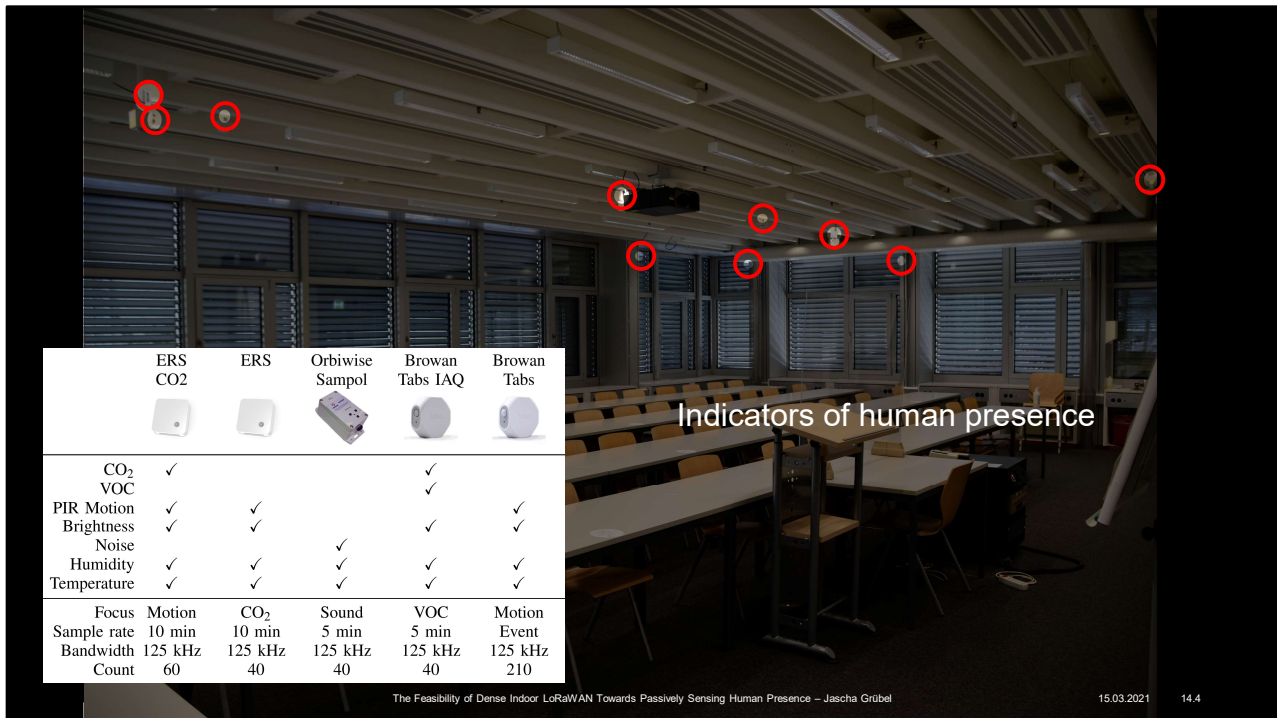
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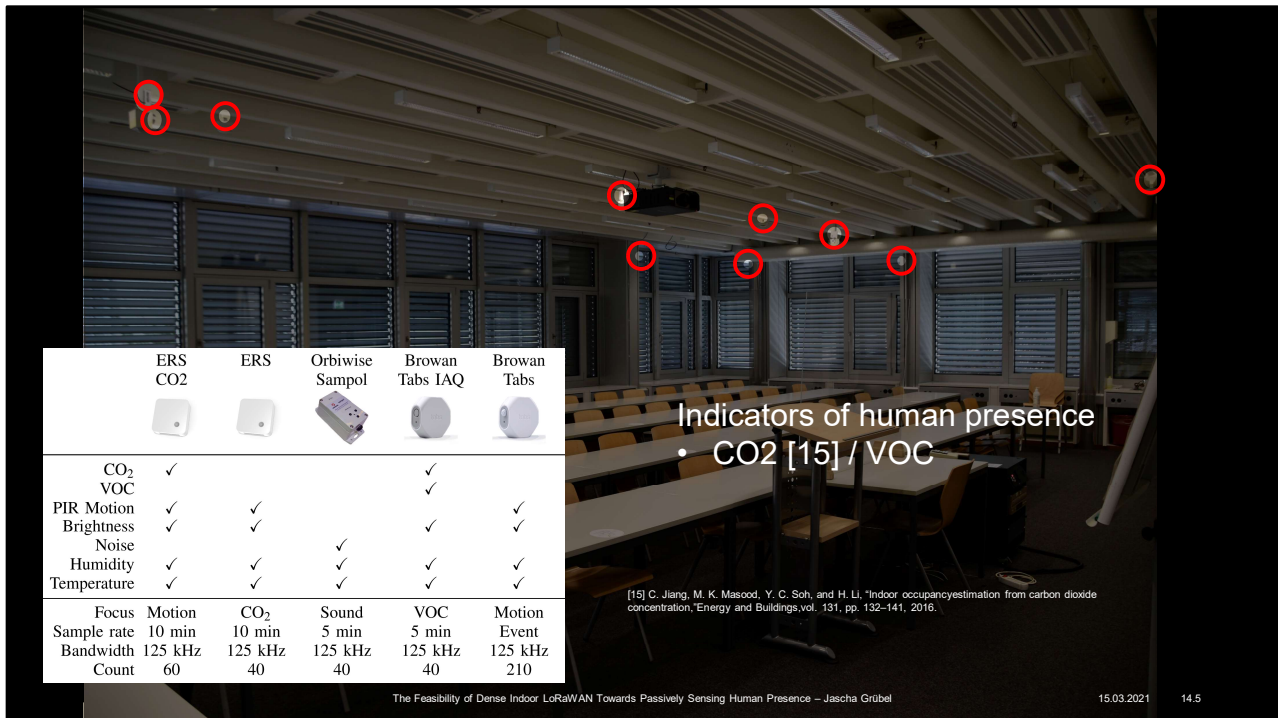
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Indicators of human presence

- CO2 [15] / VOC
- Noise [16]

	ERS CO2	ERS	Orbiwise Sampol	Browan Tabs IAQ	Browan Tabs
CO <sub>2</sub>	✓			✓	
VOC				✓	
PIR Motion	✓	✓			✓
Brightness	✓	✓		✓	✓
Noise			✓	✓	✓
Humidity	✓	✓	✓	✓	✓
Temperature	✓		✓		✓
Focus	Motion	CO <sub>2</sub>	Sound	VOC	Motion
Sample rate	10 min	10 min	5 min	5 min	Event
Bandwidth	125 kHz	125 kHz	125 kHz	125 kHz	125 kHz
Count	60	40	40	40	210

[15] C. Jiang, M. K. Masood, Y. C. Soh, and H. Li, "Indoor occupancy estimation from carbon dioxide concentration," *Energy and Buildings*, vol. 131, pp. 132–141, 2016.

[16] Z. Yang and B. Becker-Gerber, "Modelling personalized occupancy profiles for representing long term patterns by using ambient context," *Building and Environment*, vol. 78, pp. 23–35, 2014.

The Feasibility of Dense Indoor LoRaWAN Towards Passively Sensing Human Presence – Jascha Grübel 15.03.2021 14.6

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	ERS CO2	ERS	Orbiwise Sampol	Browan Tabs IAQ	Browan Tabs
CO <sub>2</sub>	✓			✓	
VOC				✓	
PIR Motion	✓	✓			✓
Brightness	✓	✓		✓	✓
Noise			✓	✓	✓
Humidity	✓	✓	✓	✓	✓
Temperature	✓	✓	✓	✓	✓
Focus	Motion	CO <sub>2</sub>	Sound	VOC	Motion
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Indicators of human presence

- CO<sub>2</sub> [15] / VOC
- Noise [16]
- Motion [17]

[15] C. Jiang, M. K. Masood, Y. C. Soh, and H. Li, "Indoor occupancy estimation from carbon dioxide concentration," *Energy and Buildings*, vol. 131, pp. 132–141, 2016.

[16] Z. Yang and B. Becker-Gerber, "Modeling personalized occupancy profiles for representing long term patterns by using ambient context," *Building and Environment*, vol. 78, pp. 23–36, 2014.

[17] P. Liu, S. Nguang, and A. Partridge, "Occupancy Inference Using Pyroelectric Infrared Sensors Through Hidden Markov Models," *IEEE Sensors J.*, vol. 16, no. 4, pp. 1062–1068, 2 2016.

The Feasibility of Dense Indoor LoRaWAN Towards Passively Sensing Human Presence – Jascha Gröbel 15.03.2021 14.7

We start in a lecture hall in the building.

[C] 5 types of LoRaWAN sensors are placed out of sight in all public spaces of the building.

[C] We chose the types based on their ability to indicate human presence.

Previous research has connected

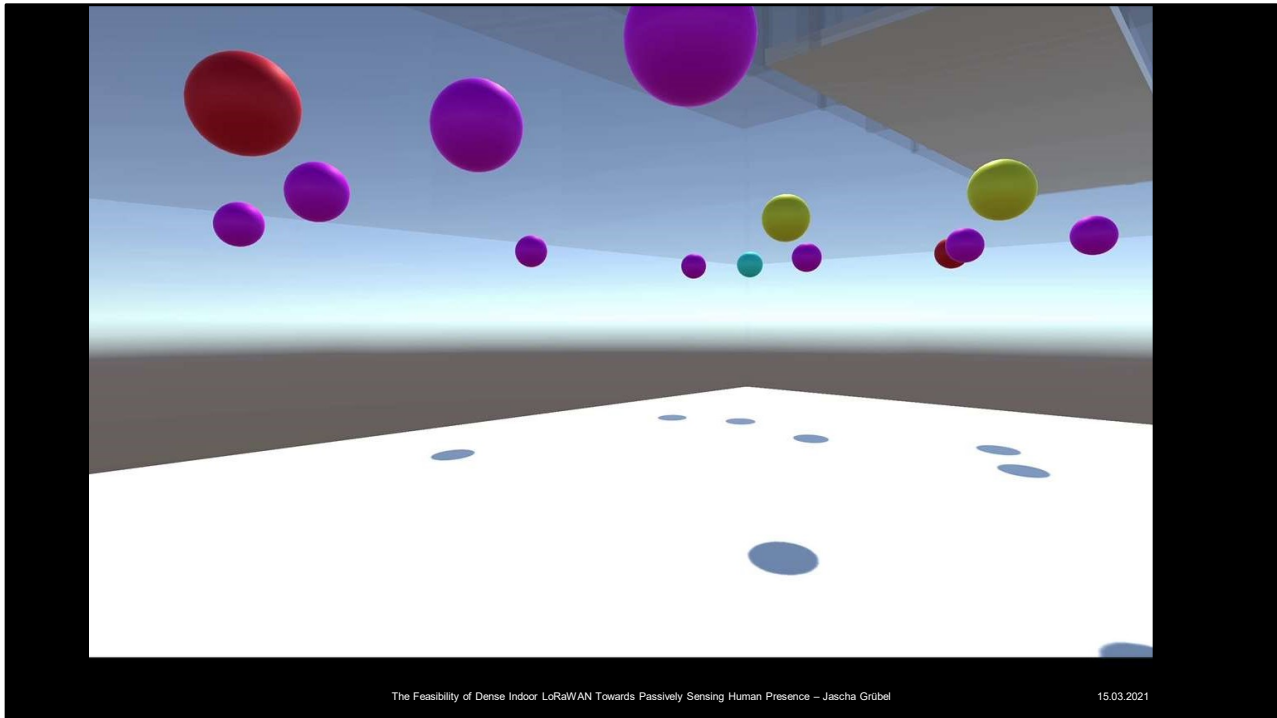
[C] levels of CO<sub>2</sub>,

[C] levels of Noise, and

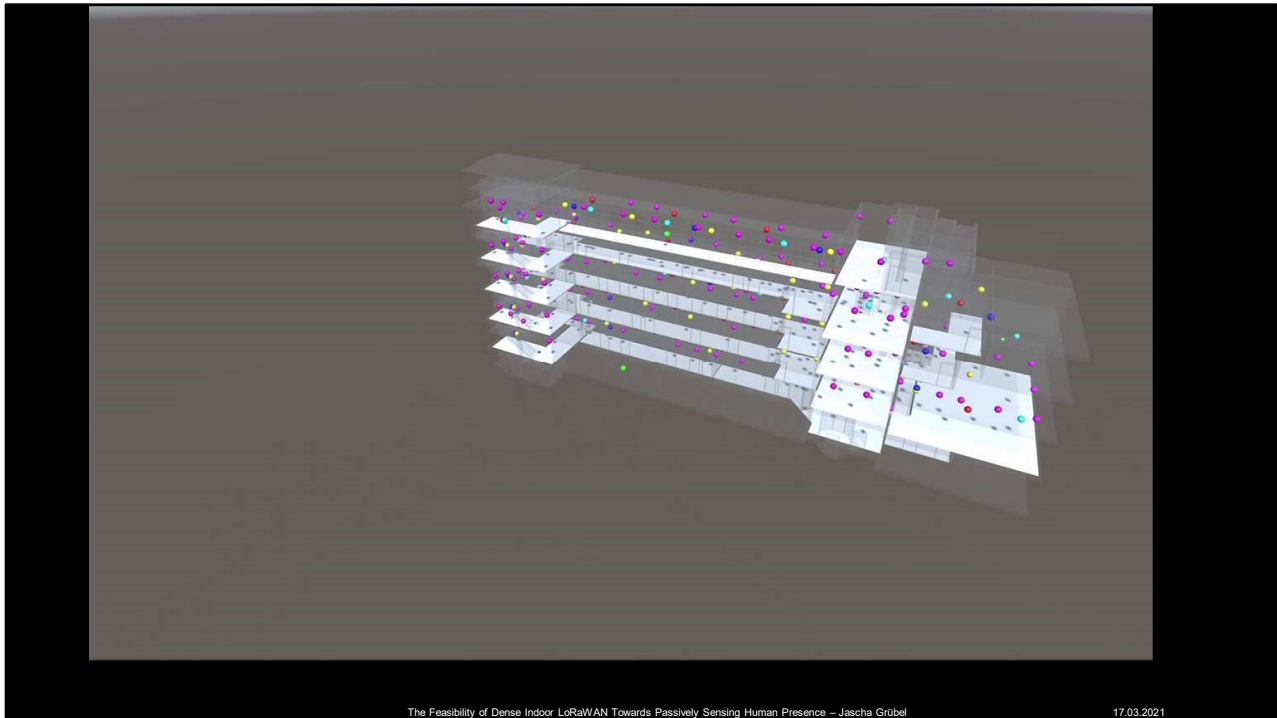
[C] Motion detection in particular to human presence.

[C] We transition to virtual representation of the lecture hall in the digital twin.

[NS]



The digital twin is employed to manage the data and visualize the 390 sensors. Please note particularly the green nodes representing gateways. One is now appearing from the left in the non-public part of the building 3 floors below. We can also see the 5 sensor types color-coded in cyan, yellow, blue, purple, and red.

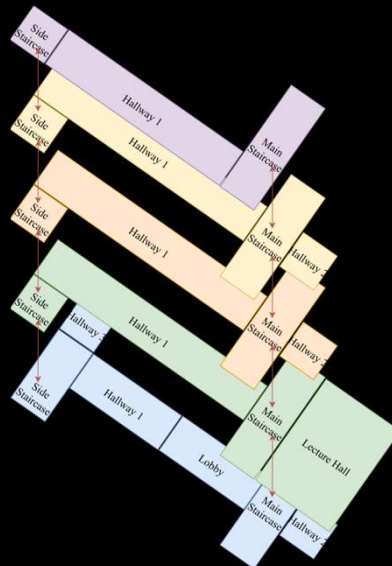


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## Classicist three layer IoT model



The Feasibility of Dense Indoor LoRaWAN Towards Passively Sensing Human Presence – Jascha Grübel

15.03.2021 16.1

We transition to this schematic view of the building where we show the 21 rooms across the 5 floors involved in our setup.

[C] To structure our system, a classicist three layer IoT model is applied.

[C] The data collection consists of a sensor network in the building.

All 390 sensors use battery-powered LoRa class A and are evenly distributed across floor space.

[C] The transmission is managed by a service-oriented architecture middleware.

It consists of 3 independent modular components.

First, the LoRaWAN gateways receive the sensor data and forwards it to the LoRaWAN network server for meta-data augmentation, decoding and decryption.

Then our own database server receives the sensor data and stores them in a PostgreSQL database with extensions to manage spatial and temporal data, PostGIS and TimescaleDB, respectively.

Each component is independent and could be replaced with another implementation.

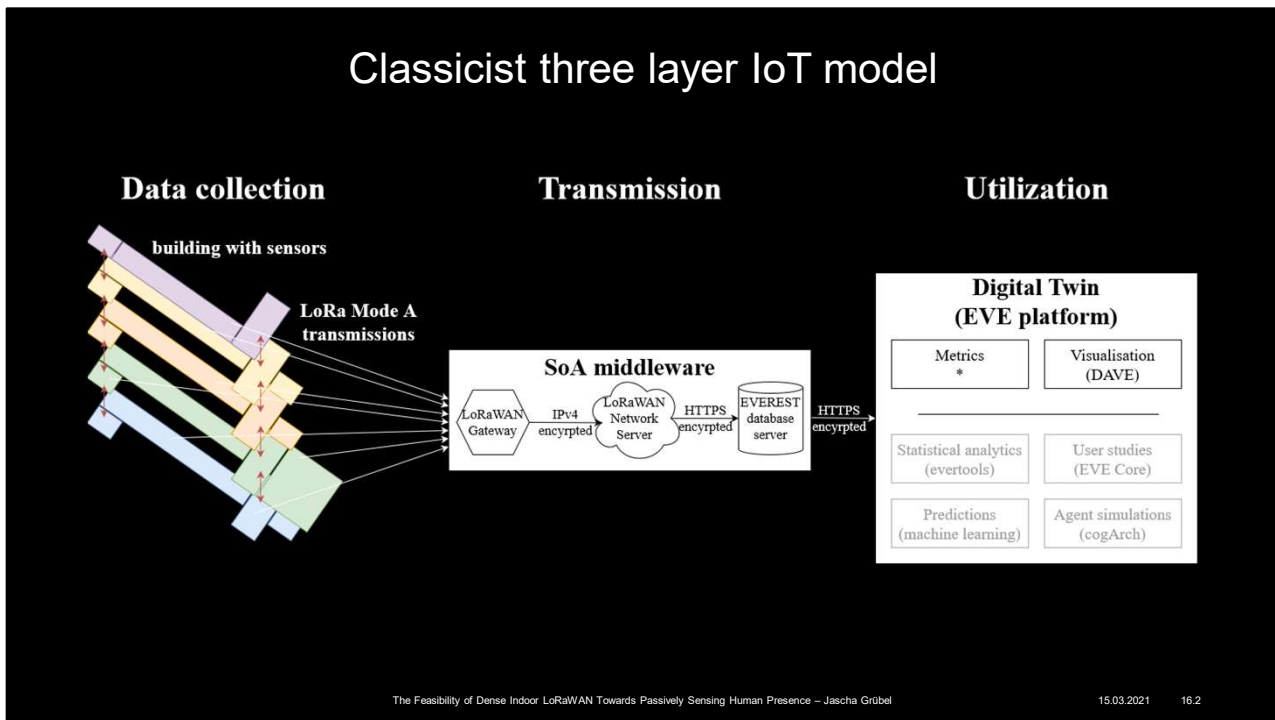
[C] The end user utilization is enabled through the digital twin, we saw a preview just now in the fly-through.

We base the digital twin on a development version of our open-source platform for virtual reality data collection and analysis EVE.

Before we move on, let me draw the attention to two particular aspects of the implementation in the SoA Middleware.



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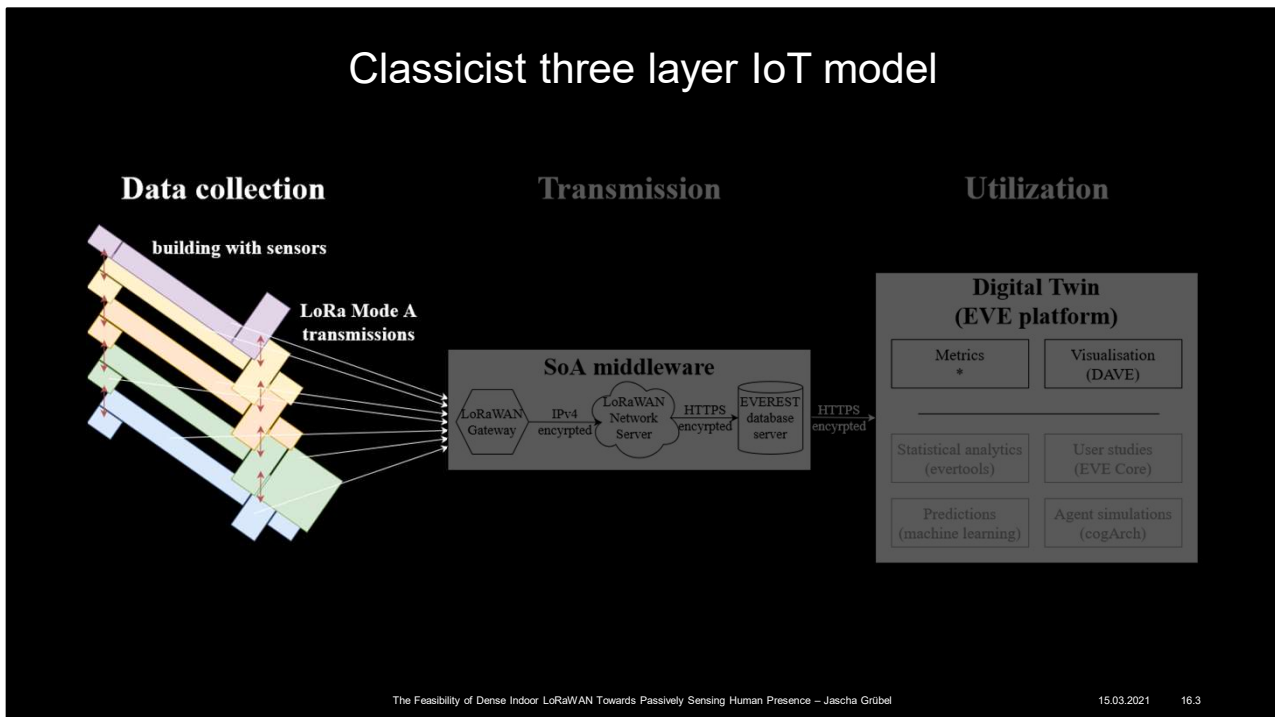
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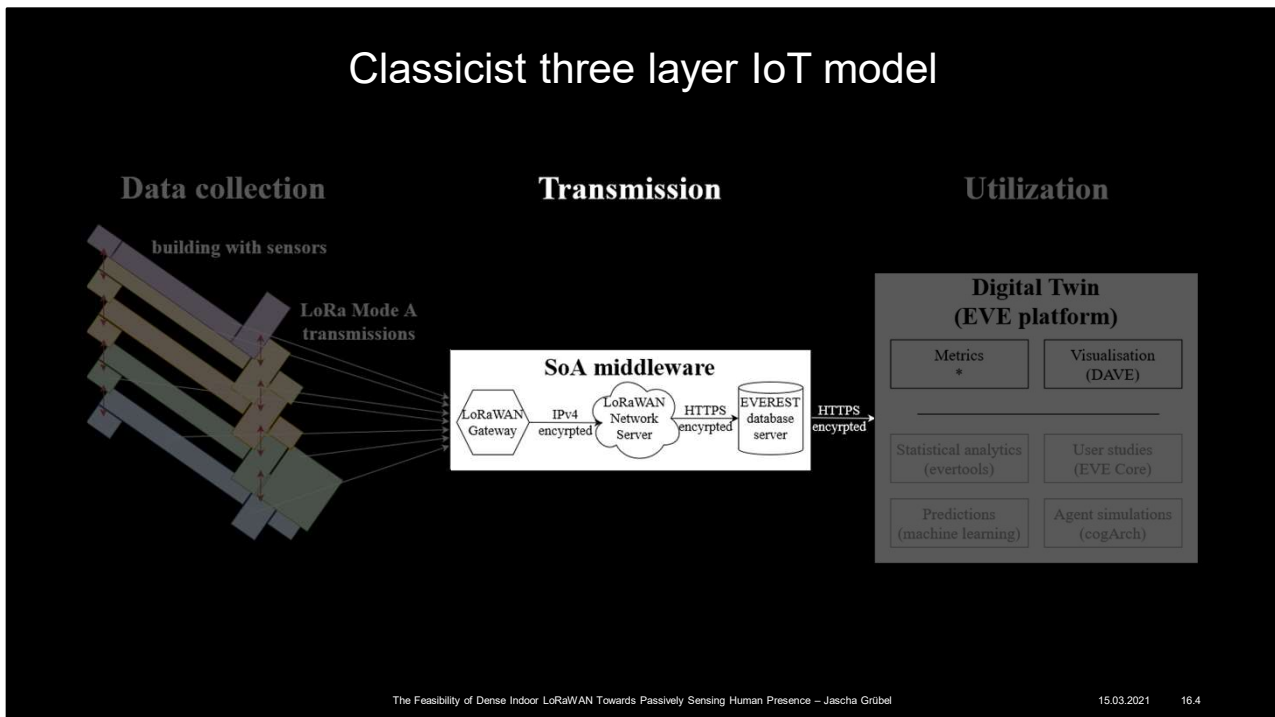
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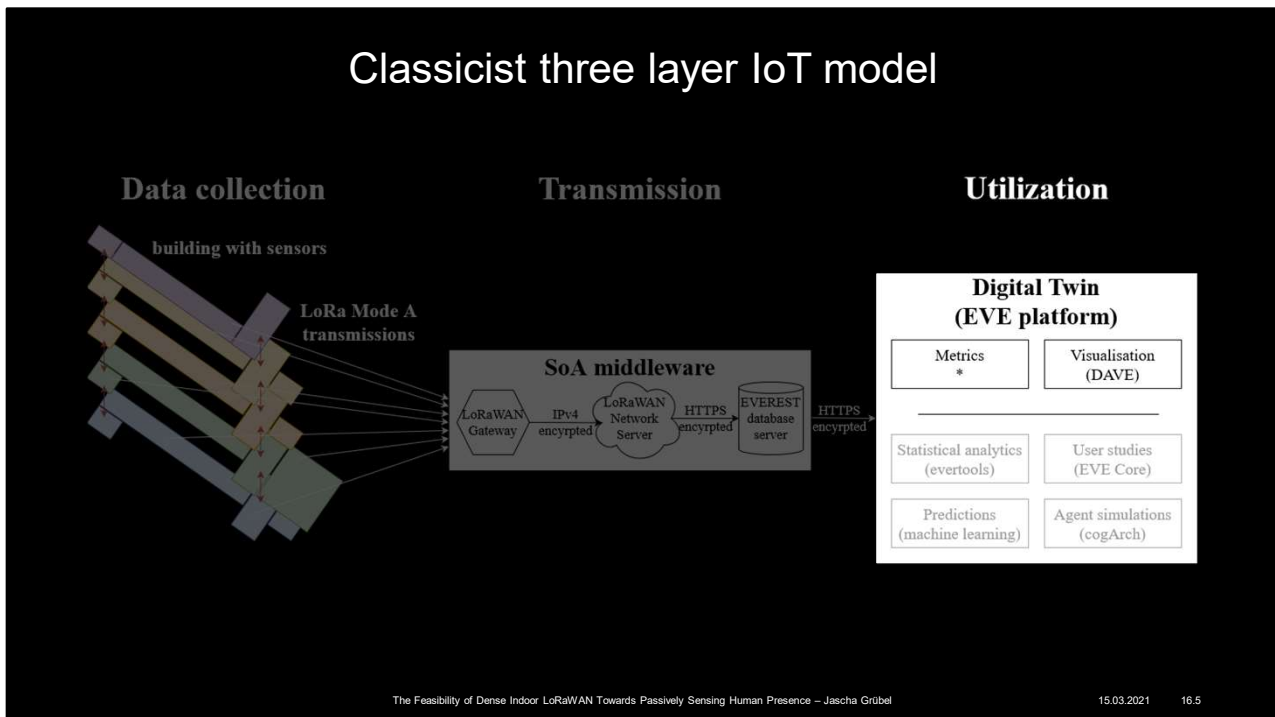
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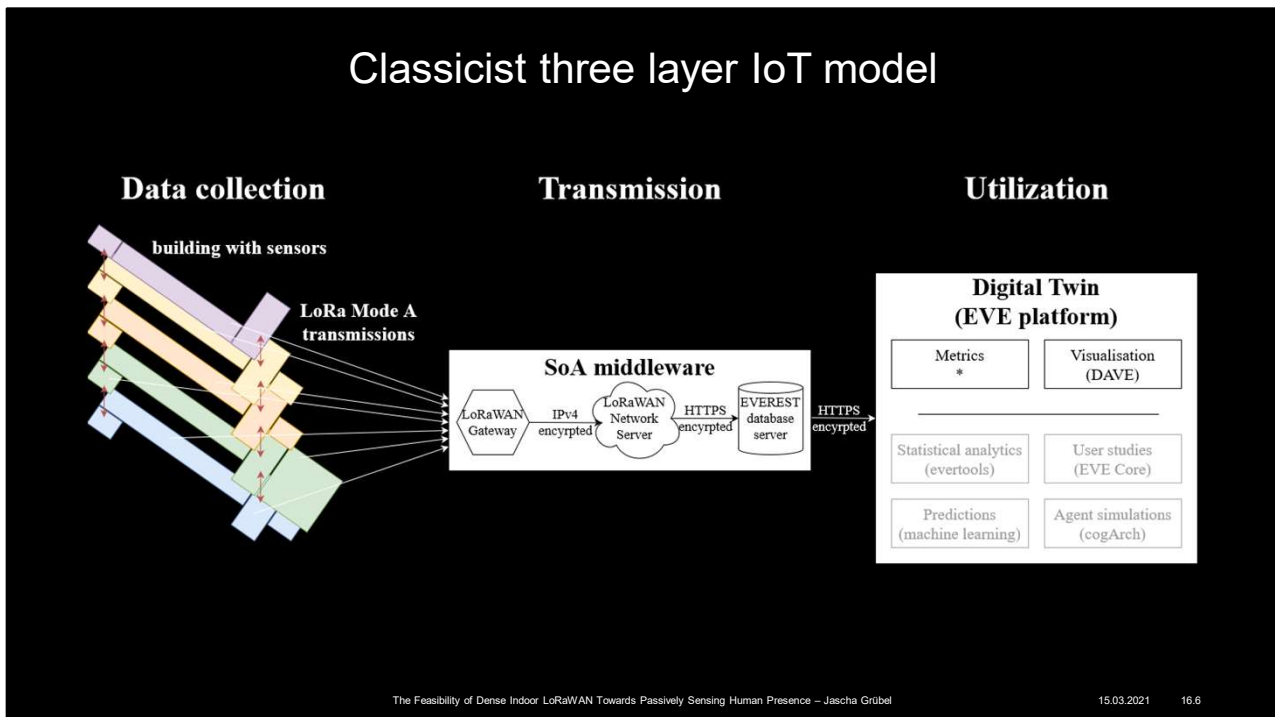
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# Transmission LoRaWAN Adaptation

## Adaptive Data Rate (ADR) and Link Adaptation Policy (LAP)

The first implementation details is about conserving energy with so many devices.

We use a variation of Adaptive Data Rate (or ADR) and Link Adaptation Policy (or LAP).

[C] The network server performs a two-step optimization.

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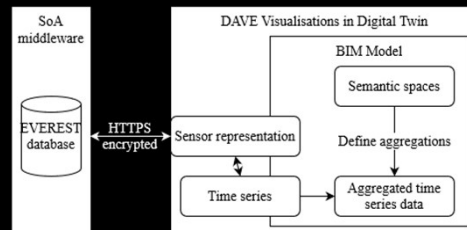
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The second implementation detail is how to make utilization independent from the SoA middleware implementation.

[C] We employ Representational State Transfer Hypertext Application Language (or REST-HAL) for communication between the database server in the SoA and Digital Twin.

This expansion of REST adds relational links and embeddings between entries.

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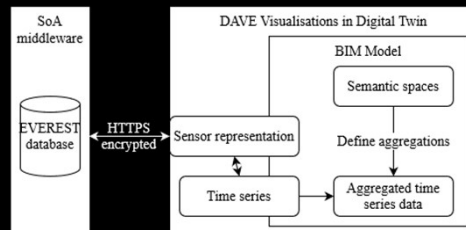
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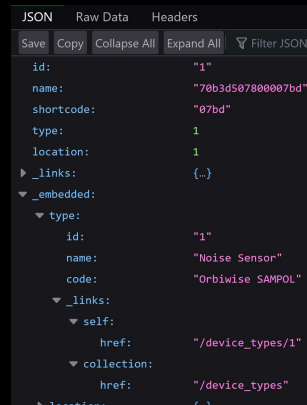
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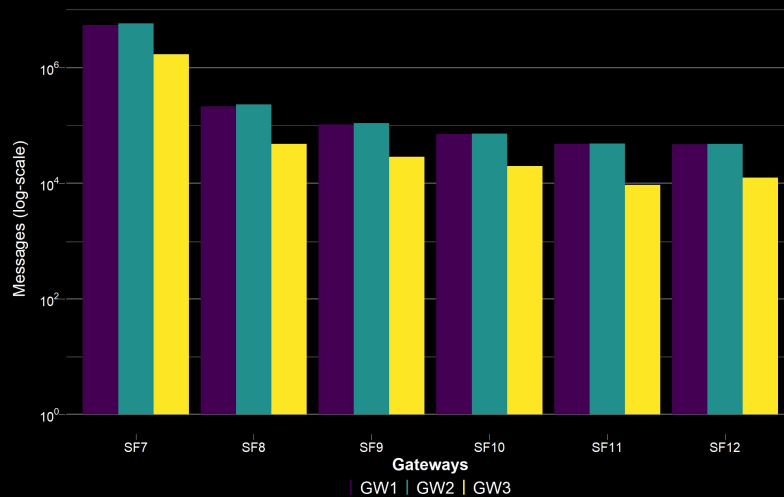
# Results

## Descriptives

With a detailed overview of the system.

Let's first look at the descriptives of the data to understand what we have at our hand.

## Transmissions across spreading factors (SF)



The Feasibility of Dense Indoor LoRaWAN Towards Passively Sensing Human Presence – Jascha Grübel

15.03.2021 20.1

Let's start with understanding how our data was transmitted.

Overall, our 14 million transmissions are unevenly spread across spreading factor (SF).

[C] Each bar color represents a gateway and they are group by SF.

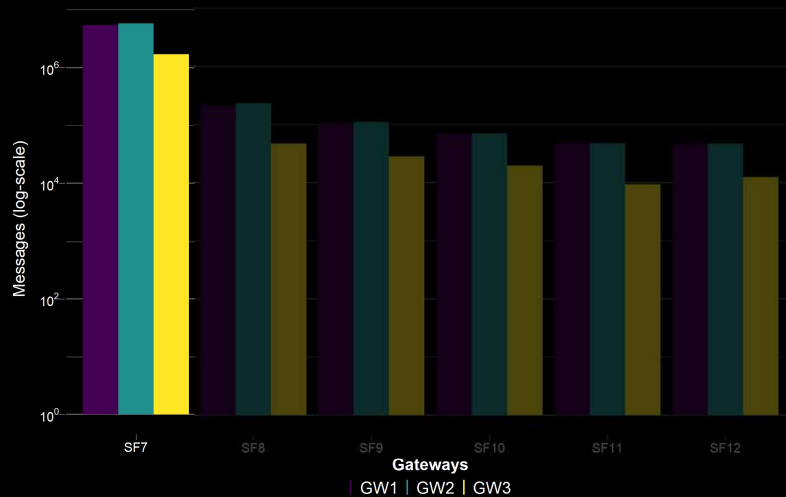
More than 90% of transmissions occur on SF7.

[C] A log scale as used to make the decrease in higher SF visible.

Given the short distances involved, SF7 would be the best choice for transmission.

We want to gain a deeper understanding why our system used higher SF.

## Transmissions across spreading factors (SF)



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15.03.2021 20.2

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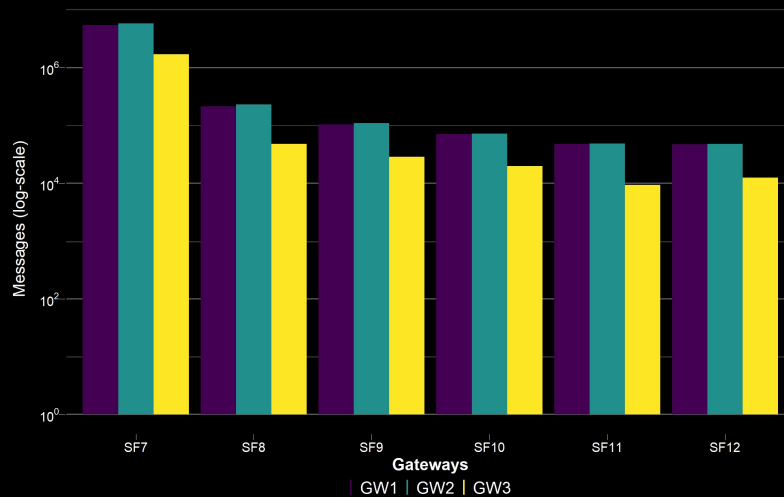
More than 90% of transmissions occur on SF7.

[C] A log scale as used to make the decrease in higher SF visible.

Given the short distances involved, SF7 would be the best choice for transmission.

We want to gain a deeper understanding why our system used higher SF.

## Transmissions across spreading factors (SF)



The Feasibility of Dense Indoor LoRaWAN Towards Passively Sensing Human Presence – Jascha Grübel

15.03.2021 20.3

Let's start with understanding how our data was transmitted.

Overall, our 14 million transmissions are unevenly spread across spreading factor (SF).

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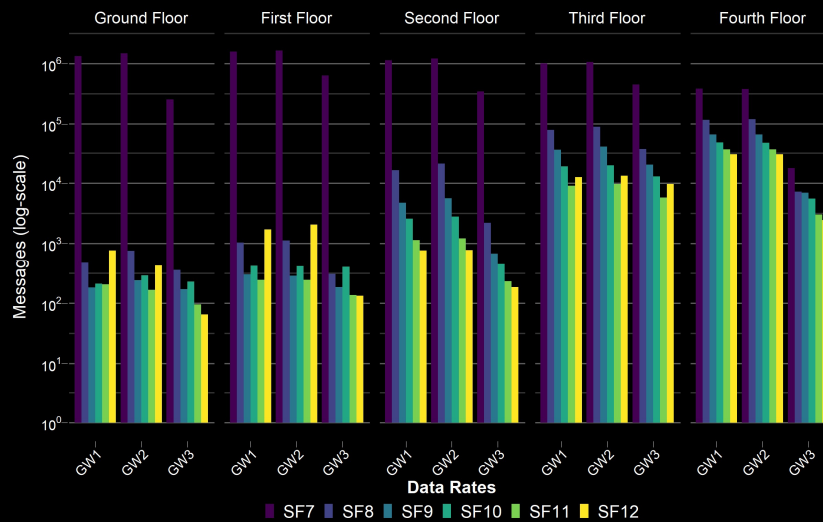
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## Transmissions across spreading factors (SF) by floors



The Feasibility of Dense Indoor LoRaWAN Towards Passively Sensing Human Presence – Jascha Grübel

15.03.2021 21.1

Dividing the transmissions by floor gives us more insight into the use of higher SF.

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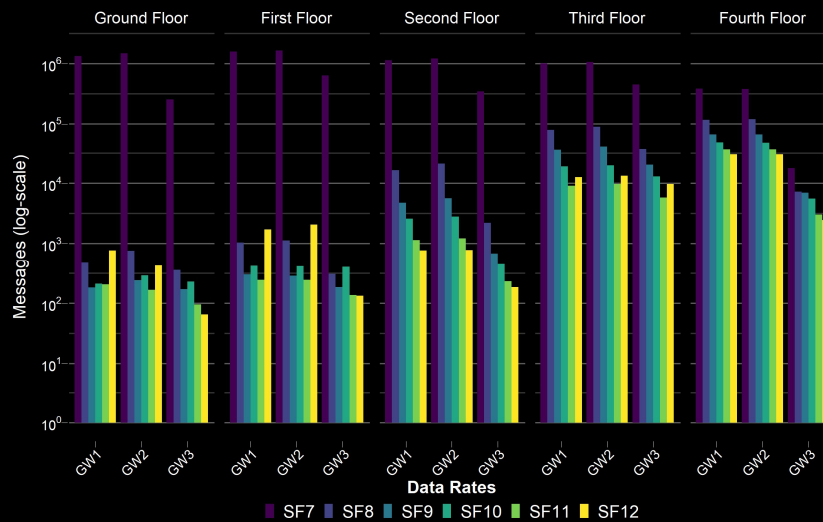
[C] grouped by gateways and

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[C] Higher SF are used more often for transmission, the further we are from the gateways in the ground floor and below.

This indicates that SF7 is limited indoors in its transmission capacity even at short distance below 64 meters.

## Transmissions across spreading factors (SF) by floors



The Feasibility of Dense Indoor LoRaWAN Towards Passively Sensing Human Presence – Jascha Grübel

15.03.2021 21.2

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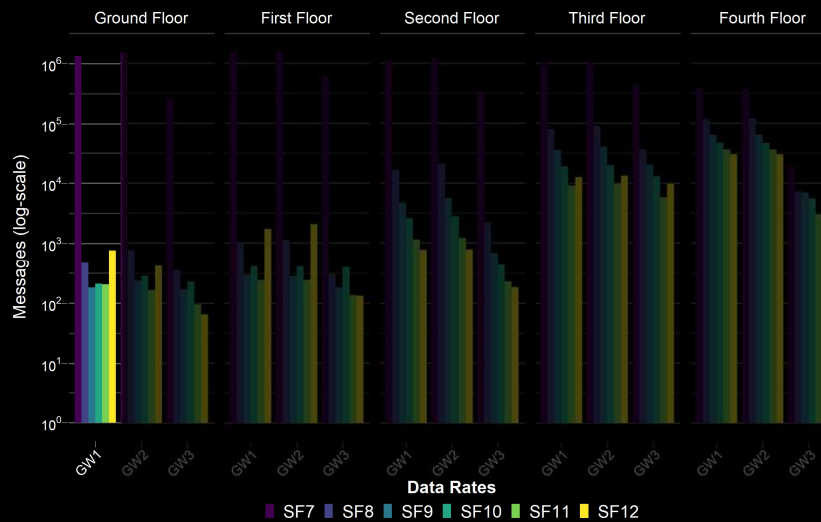
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The Feasibility of Dense Indoor LoRaWAN Towards Passively Sensing Human Presence – Jascha Grübel

15.03.2021 21.3

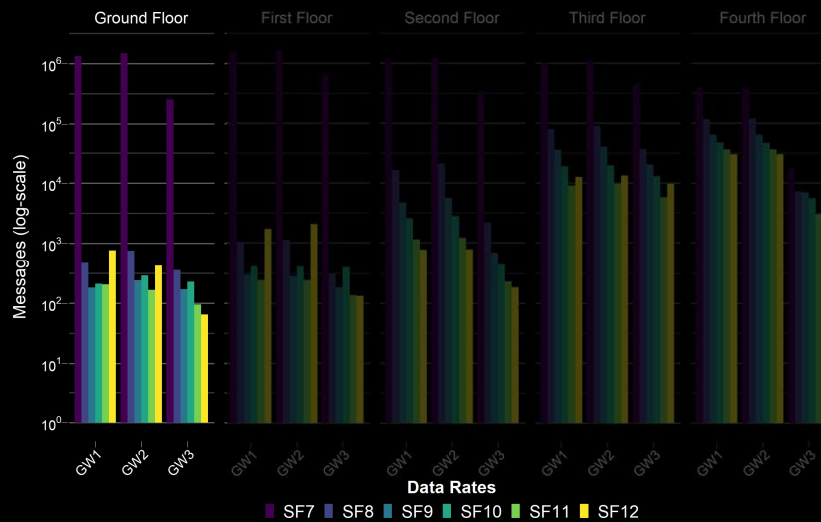
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## Transmissions across spreading factors (SF) by floors



The Feasibility of Dense Indoor LoRaWAN Towards Passively Sensing Human Presence – Jascha Gröbel

15.03.2021 21.4

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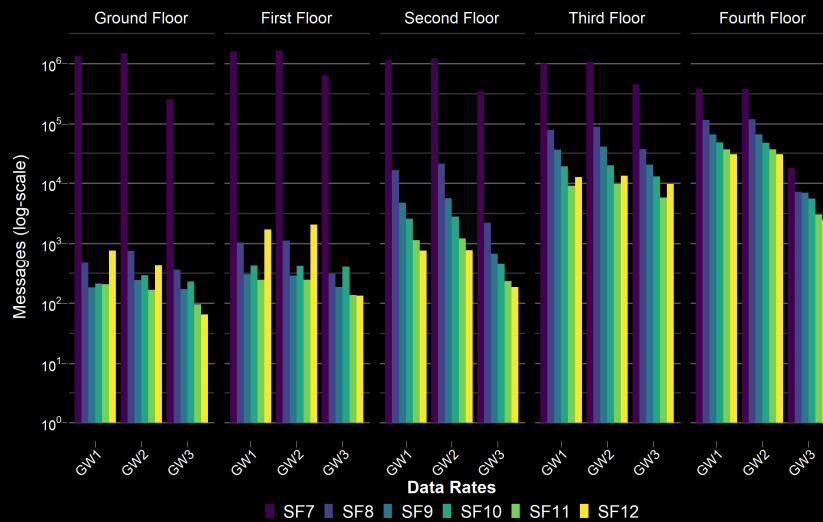
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## Transmissions across spreading factors (SF) by floors



The Feasibility of Dense Indoor LoRaWAN Towards Passively Sensing Human Presence – Jascha Gröbel

15.03.2021 21.5

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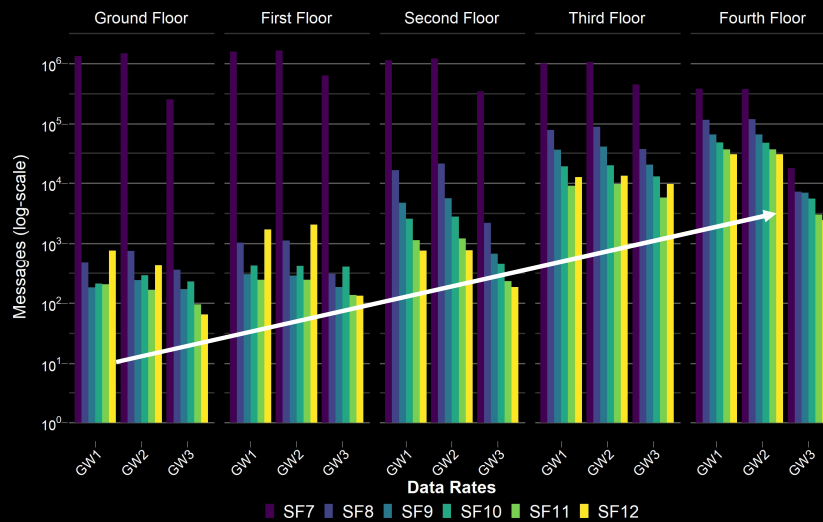
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## Transmissions across spreading factors (SF) by floors



The Feasibility of Dense Indoor LoRaWAN Towards Passively Sensing Human Presence – Jascha Grübel

15.03.2021 21.6

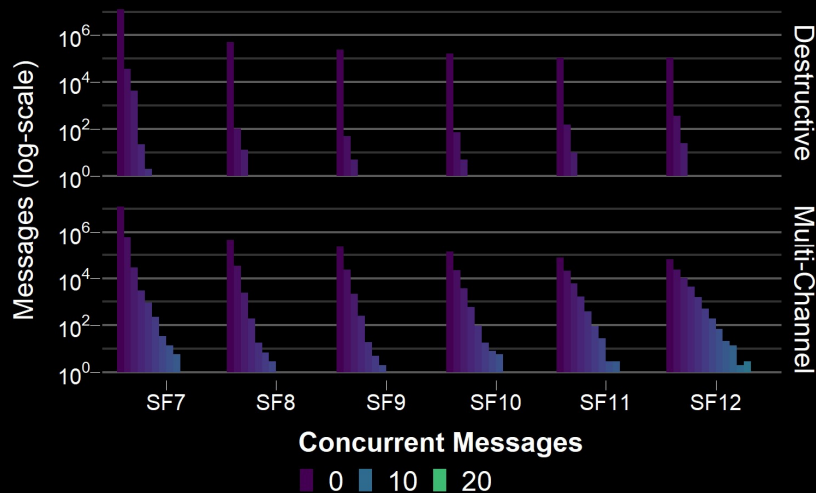
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## Concurrent transmissions across spreading factors



The Feasibility of Dense Indoor LoRaWAN Towards Passively Sensing Human Presence – Jascha Grübel

15.03.2021 22.1

Theoretical discussions on LoRaWAN often discuss the maximal capacity and the risk of destructive concurrent transmissions limiting the system.

We would like to know whether this is the case in our system.

Here is a quick reminder from the definition of chirps:

Destructive concurrent transmission are send at the same time, on the same channel, and at the same SF.

Whereas multi-channel concurrent transmission are send at the same time and the same SF but on a different channel.

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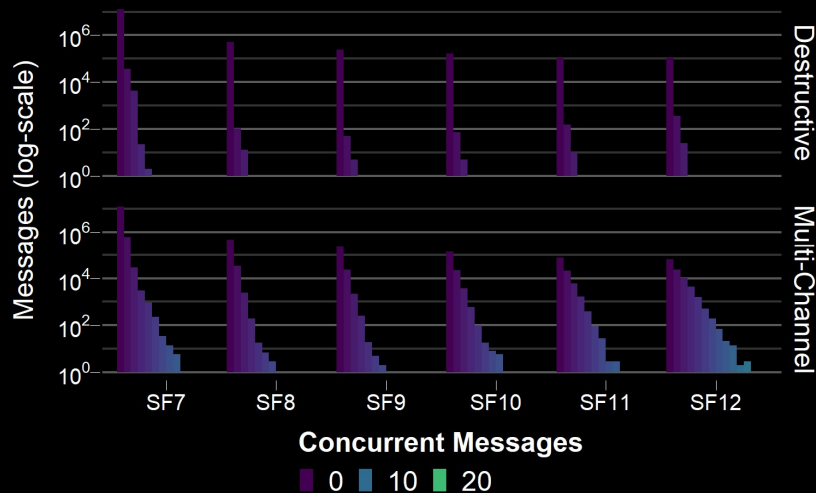
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transmissions.

However, a trend can be observed that will play a more crucial role in an even denser system.

## Concurrent transmissions across spreading factors



The Feasibility of Dense Indoor LoRaWAN Towards Passively Sensing Human Presence – Jascha Gröbel

15.03.2021 22.2

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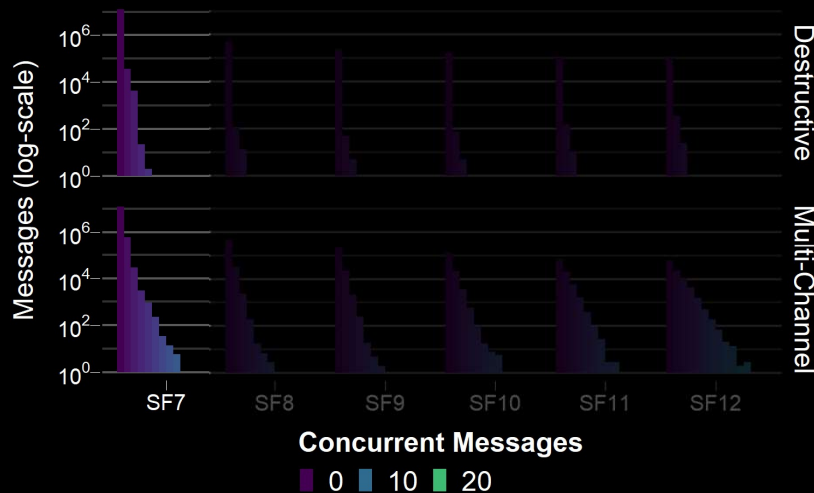
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The Feasibility of Dense Indoor LoRaWAN Towards Passively Sensing Human Presence – Jascha Grübel

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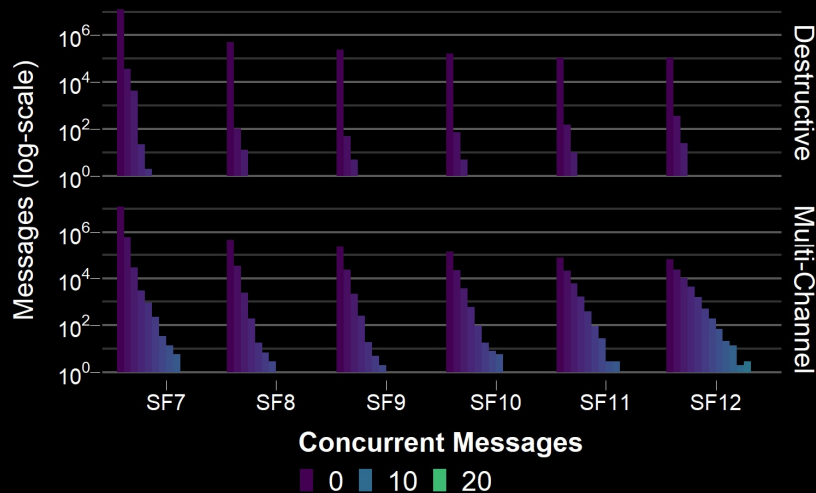
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## Concurrent transmissions across spreading factors



The Feasibility of Dense Indoor LoRaWAN Towards Passively Sensing Human Presence – Jascha Grübel

15.03.2021 22.4

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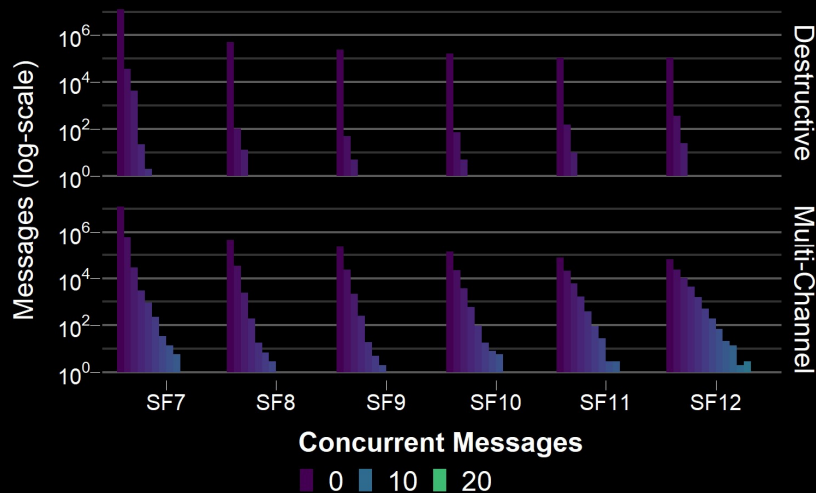
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The Feasibility of Dense Indoor LoRaWAN Towards Passively Sensing Human Presence – Jascha Grübel

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## Concurrent transmissions across spreading factors



The Feasibility of Dense Indoor LoRaWAN Towards Passively Sensing Human Presence – Jascha Grübel

15.03.2021 22.6

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## Concurrent transmissions across spreading factors



The Feasibility of Dense Indoor LoRaWAN Towards Passively Sensing Human Presence – Jascha Gröbel

15.03.2021 22.7

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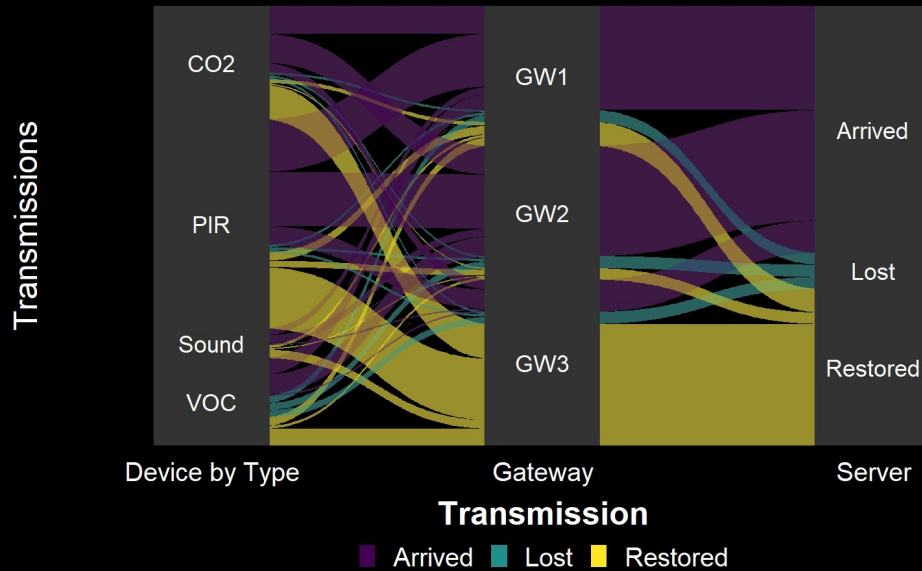
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## Overview of Frame Error Rate (FER)



The Feasibility of Dense Indoor LoRaWAN Towards Passively Sensing Human Presence – Jascha Gröbel

15.03.2021 23.1

We would also like to know how many transmissions we did lose in our system.

The Frame Error Rate (or FER) can indicate how many transmissions were completely lost.

In this parallel set plot, each transmission is shown once per gateway.

[C] The first column consists of the 5 sensor types,

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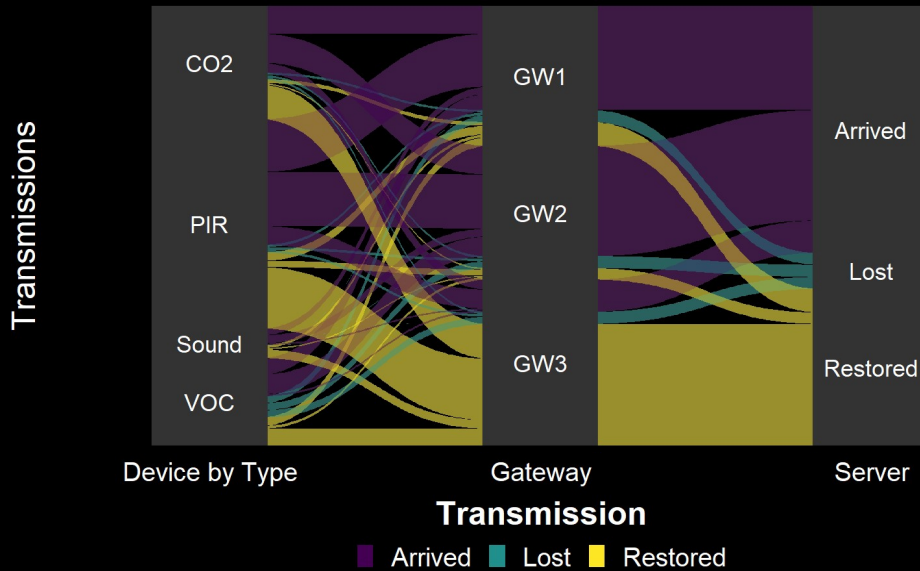
We use the frame count from the sensor devices to establish whether all transmissions are received in a sequence. A jump in the sequence indicates a frame that was not received by any gateway.

[C] Lastly, many transmissions could be restored because at least one gateway caught them (37%).

Note how every gateway would have lost transmissions if others had not received them.

Furthermore, pay special attention to gateway 3 which is on average more than 30m away from the sensors and required restoration of many transmissions.

## Overview of Frame Error Rate (FER)



The Feasibility of Dense Indoor LoRaWAN Towards Passively Sensing Human Presence – Jascha Gröbel

15.03.2021 23.2

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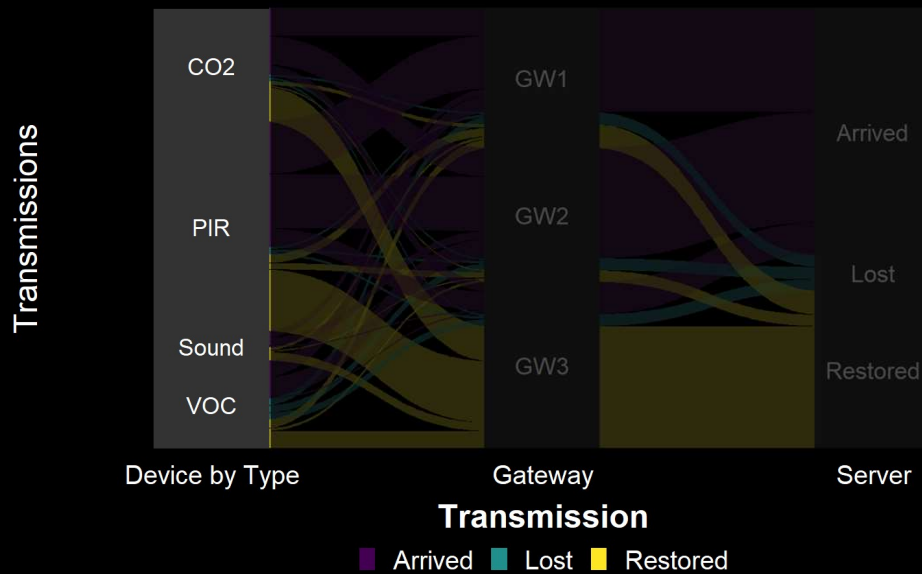
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## Overview of Frame Error Rate (FER)



The Feasibility of Dense Indoor LoRaWAN Towards Passively Sensing Human Presence – Jascha Gröbel

15.03.2021 23.3

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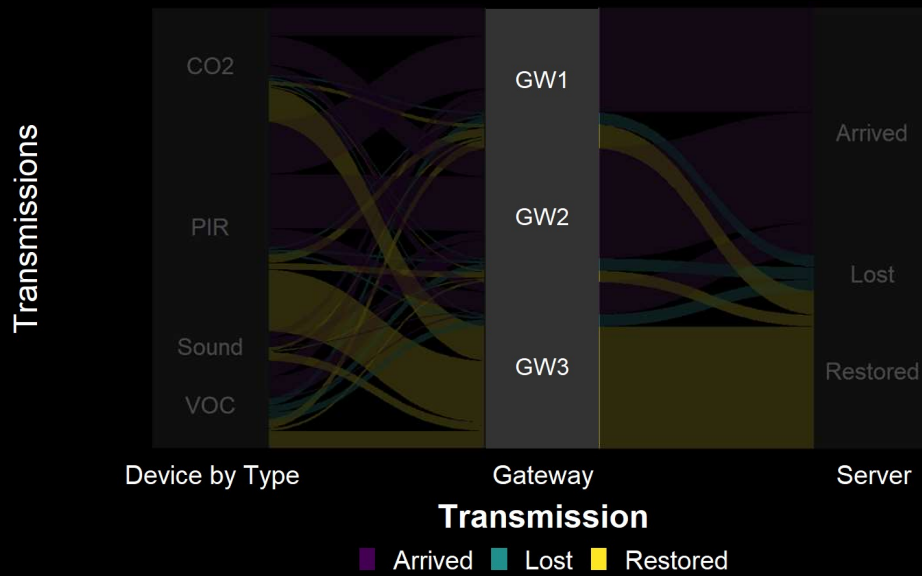
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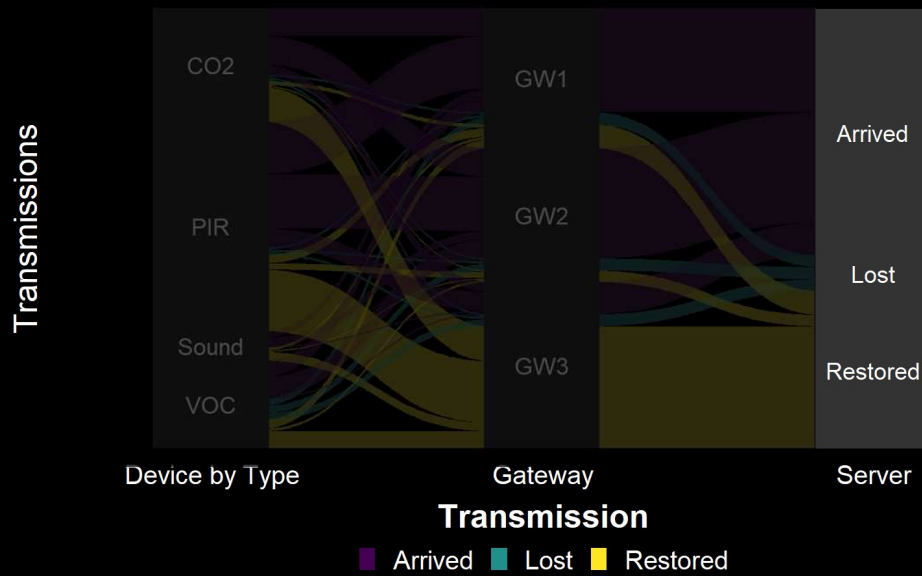
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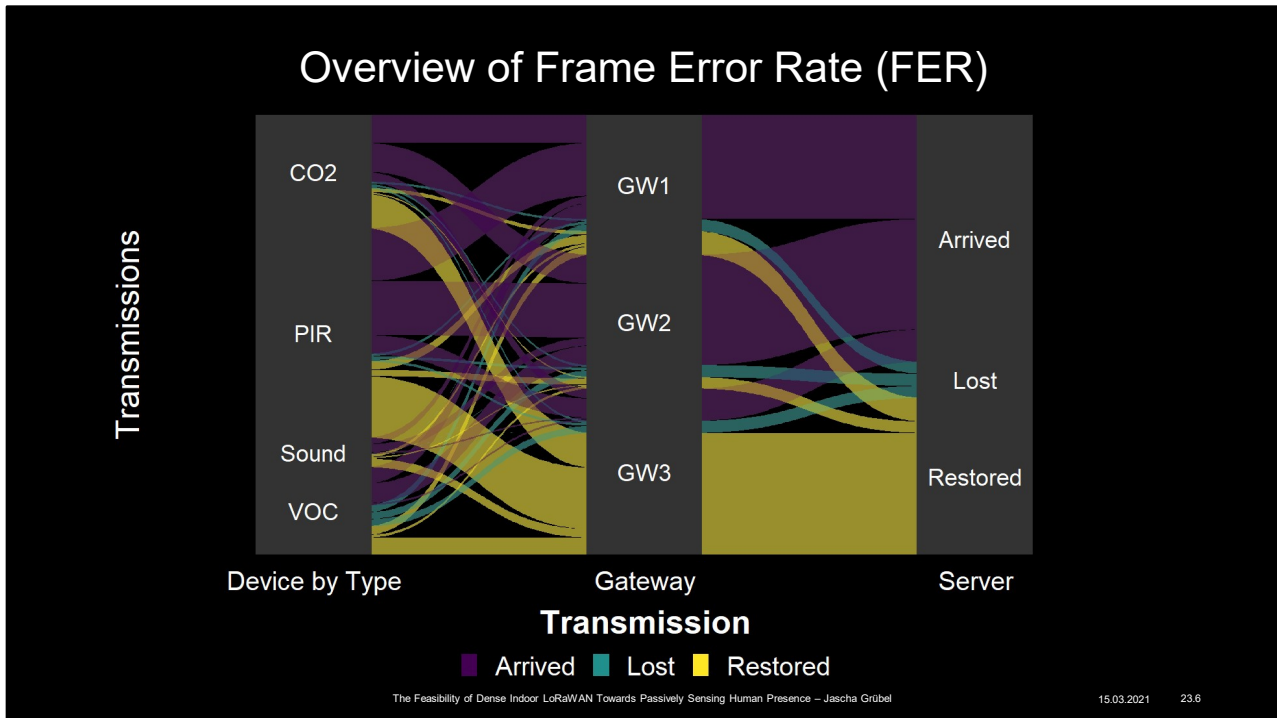
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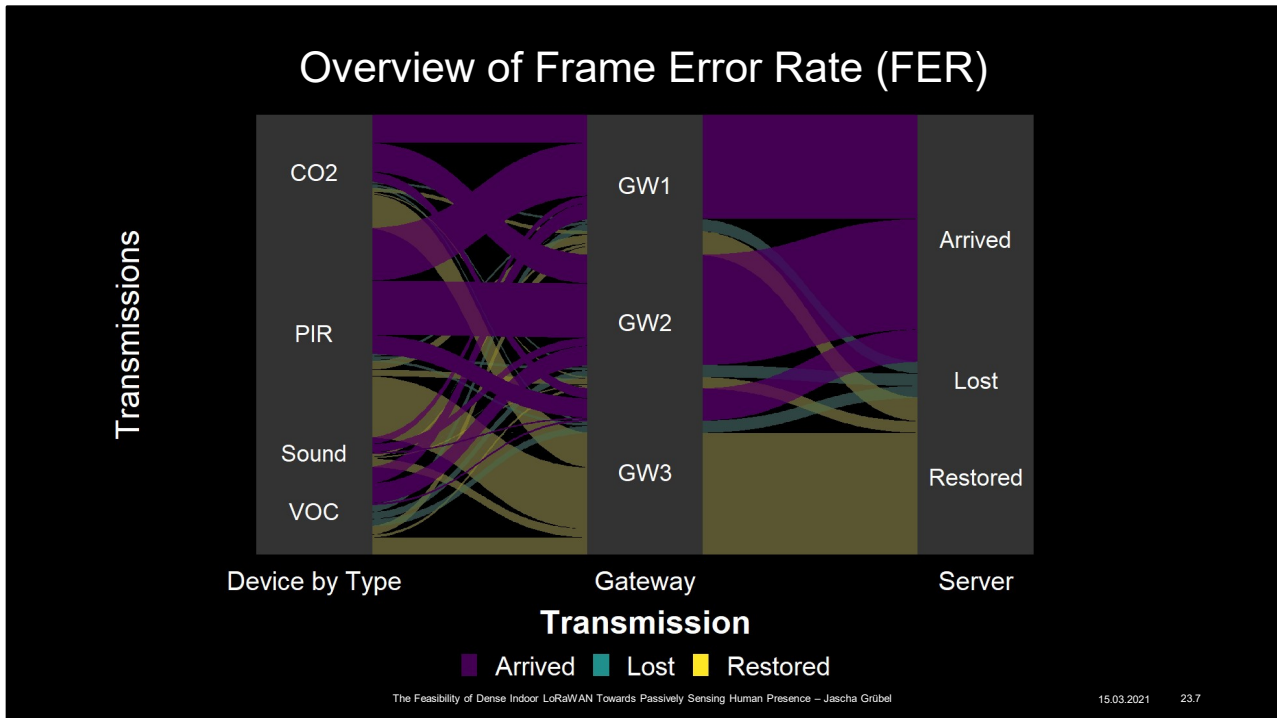
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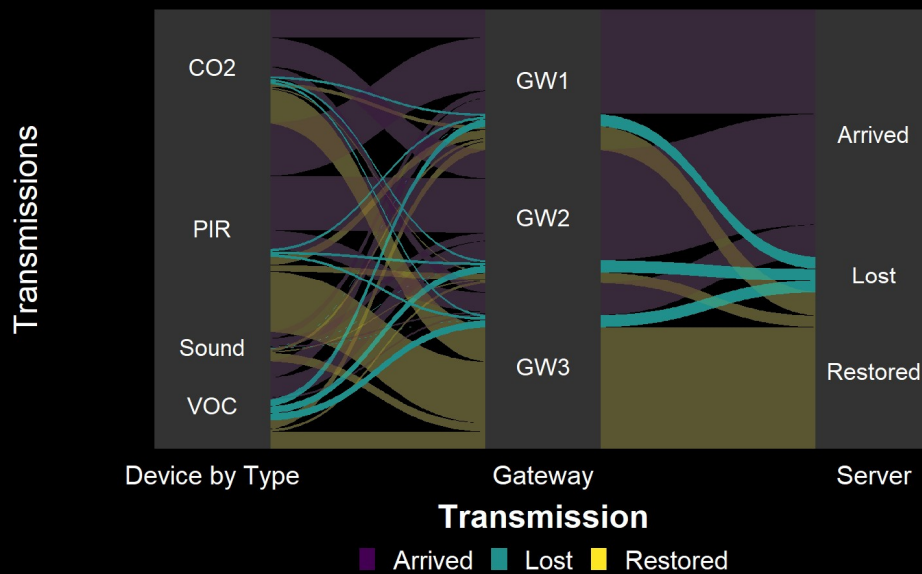
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## Overview of Frame Error Rate (FER)



The Feasibility of Dense Indoor LoRaWAN Towards Passively Sensing Human Presence – Jascha Gröbel

15.03.2021 23.8

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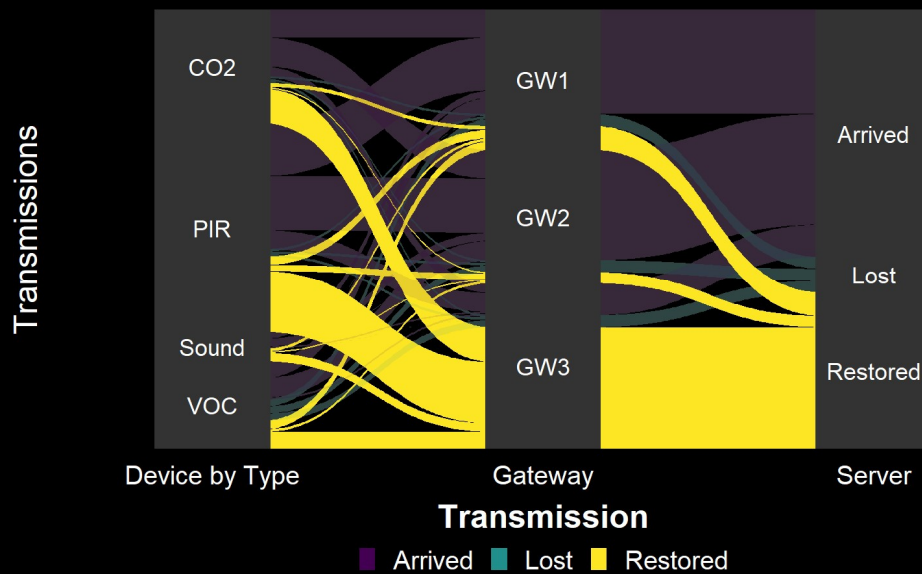
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## Overview of Frame Error Rate (FER)



The Feasibility of Dense Indoor LoRaWAN Towards Passively Sensing Human Presence – Jascha Gröbel

15.03.2021 23.9

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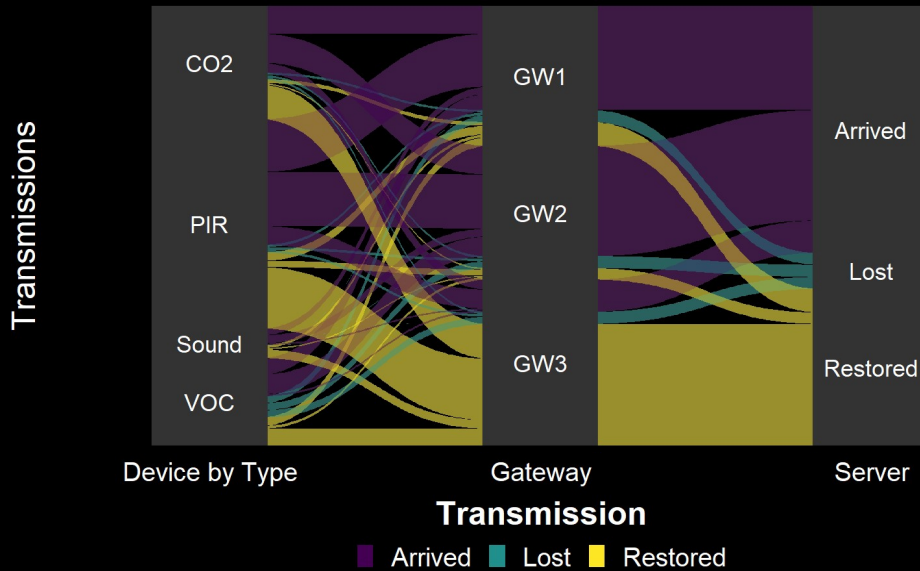
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The Feasibility of Dense Indoor LoRaWAN Towards Passively Sensing Human Presence – Jascha Gröbel

15.03.2021 23.10

We would also like to know how many transmissions we did lose in our system.

The Frame Error Rate (or FER) can indicate how many transmissions were completely lost.

In this parallel set plot, each transmission is shown once per gateway.

[C] The first column consists of the 5 sensor types,

[C] the second column of the three gateways and

[C] the last column of the status of a transmission at the network server.

[C] The diagonals indicate the status of transmissions across the system.

[C] We can see that most transmissions arrived safely at the network server (55%).

[C] Some transmissions were completely lost (8%).

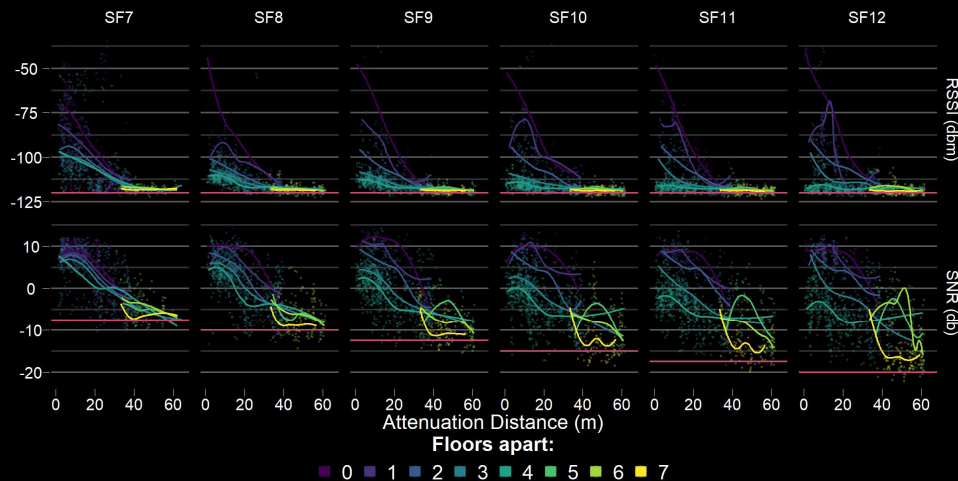
We use the frame count from the sensor devices to establish whether all transmissions are received in a sequence. A jump in the sequence indicates a frame that was not received by any gateway.

[C] Lastly, many transmissions could be restored because at least one gateway caught them (37%).

Note how every gateway would have lost transmissions if others had not received them.

Furthermore, pay special attention to gateway 3 which is on average more than 30m away from the sensors and required restoration of many transmissions.

## RSSI and SNR as a function of distance across floors and spreading factor



The Feasibility of Dense Indoor LoRaWAN Towards Passively Sensing Human Presence – Jascha Grübel

15.03.2021 24.1

We have reviewed the transmission type, concurrency and the lost messages. Going beyond the overall reception of messages we would like to understand the maximal transmission distance to ensure that all sensor devices have good coverage and as few messages as possible are lost.

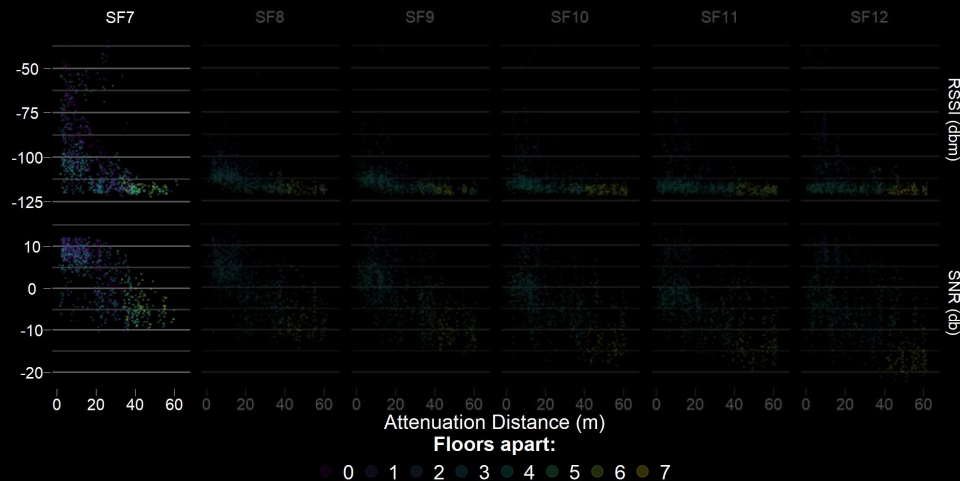
[C] Here, we show the RSSI and SNR of a random sample of transmissions by signal strength and distance, colored by floor level and faceted by SF.

[C] The approximate noise floor is indicated in purple.

[C] We use a LOESS interpolation of the average RSSI and SNR to indicate signal strength with increasing distance from the gateway.

[C] Note how beyond 30 meters, the signal quality strongly diminishes and quickly reaches the noise floor shown in red.

## RSSI and SNR as a function of distance across floors and spreading factor



The Feasibility of Dense Indoor LoRaWAN Towards Passively Sensing Human Presence – Jascha Grübel

15.03.2021 24.2

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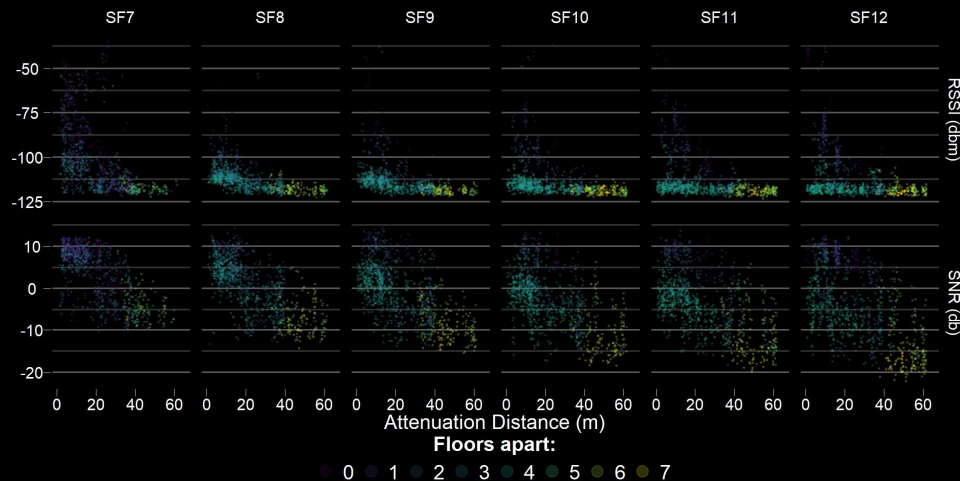
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## RSSI and SNR as a function of distance across floors and spreading factor



The Feasibility of Dense Indoor LoRaWAN Towards Passively Sensing Human Presence – Jascha Grübel

15.03.2021 24.3

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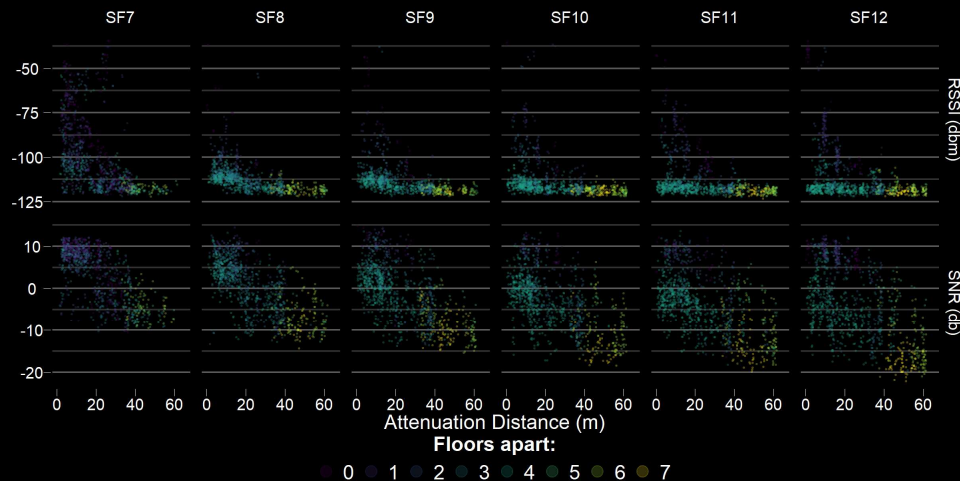
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## RSSI and SNR as a function of distance across floors and spreading factor



The Feasibility of Dense Indoor LoRaWAN Towards Passively Sensing Human Presence – Jascha Grübel

15.03.2021 24.4

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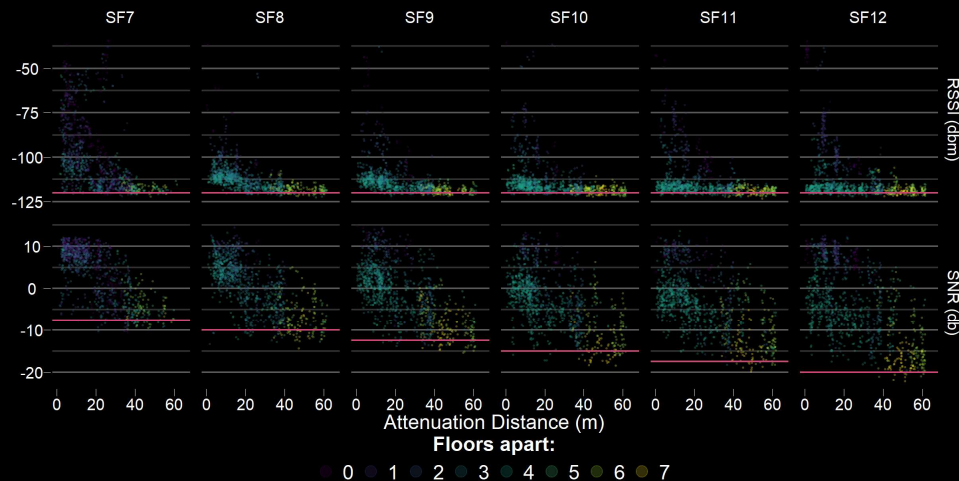
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## RSSI and SNR as a function of distance across floors and spreading factor



The Feasibility of Dense Indoor LoRaWAN Towards Passively Sensing Human Presence – Jascha Grübel

15.03.2021 24.5

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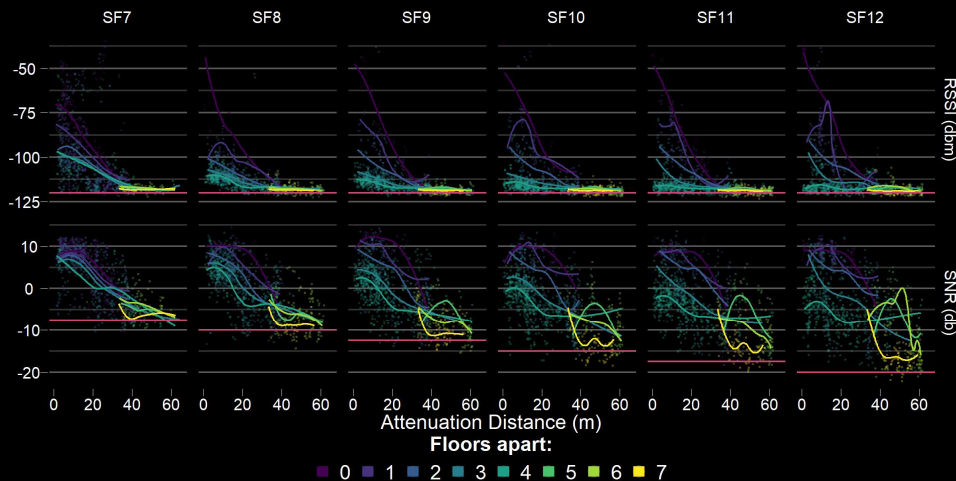
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The Feasibility of Dense Indoor LoRaWAN Towards Passively Sensing Human Presence – Jascha Grübel

15.03.2021 24.6

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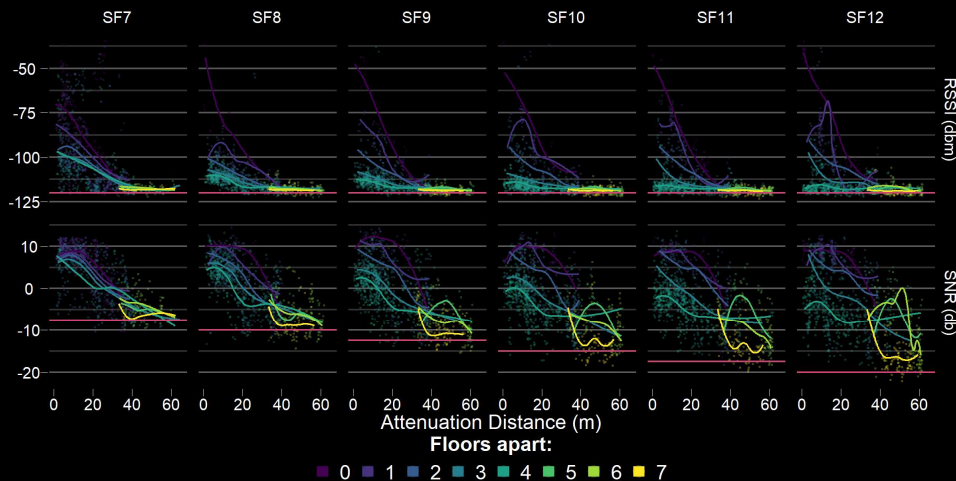
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## RSSI and SNR as a function of distance across floors and spreading factor



The Feasibility of Dense Indoor LoRaWAN Towards Passively Sensing Human Presence – Jascha Grübel

15.03.2021 24.7

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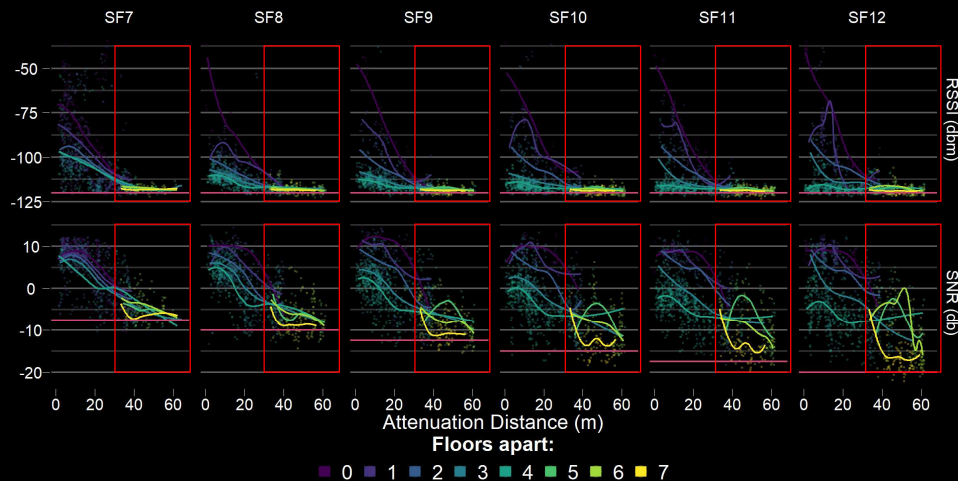
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## RSSI and SNR as a function of distance across floors and spreading factor



The Feasibility of Dense Indoor LoRaWAN Towards Passively Sensing Human Presence – Jascha Grübel

15.03.2021 24.8

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# Results

# Modelling

Beyond descriptives, we also constructed a model of the transmission indoors to make predictions on how to best place sensors.

## Mixed models account for multiple transmissions from same sensor device

We use a mixed model to account for multiple transmissions from the same sensor.

[C] We also split the data by SF to account for the uneven number of transmissions per SF.

The formula represents a model with the indices  $i$  for the devices and  $j$  for the transmissions.

[C] The constant represents the signal quality at transmission at the device.

[C] The distance variable serves as a linear black box factor to account for signal shadowing and multi-path fading.

[C] The floor variable accounts for the ceilings and the interaction separates the floors from the distance.

[C] The concurrent variable accounts for destructive concurrent transmissions.

[C] The  $b$  variable groups all  $q$  transmissions from the same sensor device

## Mixed models account for multiple transmissions from same sensor device

$$y_{ij} = \beta_0 + \beta_1 * distance_{ij} + \beta_2 * floor_{ij} + \beta_3 distance_{ij} * floor_{ij} + \beta_4 * concurrent_{ij} + b_{i1}z_{1ij} + \dots + b_{iq}z_{qij} + \epsilon_{ij}$$

- One model per spreading factor (i for device and j for transmission)

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  - Floor to account for ceilings
  - Interaction to decompose floors into distance and non-distance component
  - Concurrent to account for destructive concurrent transmissions
  - b for per sensor device grouping of transmissions (index q)

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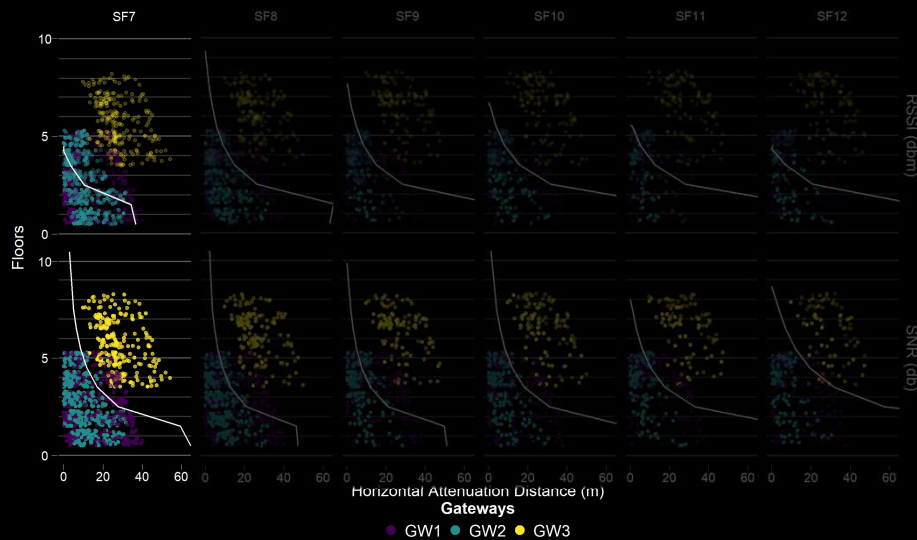
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## Transmissions compared to our mixed model



The Feasibility of Dense Indoor LoRaWAN Towards Passively Sensing Human Presence – Jascha Grübel

15.03.2021 27.1

The points in this graph represent the sensor-gateway connections with the opacity representing the signal quality.

The y-axis is scaled by the floor and the x-axis by projected meters from the gateway located at (0,0).

The real sensor-gateway distance is represented by the diagonal but points are slightly jittered for visibility.

[C] They are faceted by SF, RSSI and SNR.

[C] Our mixed model predicts a conservative maximal transmission distance for each floor (left to the white line).

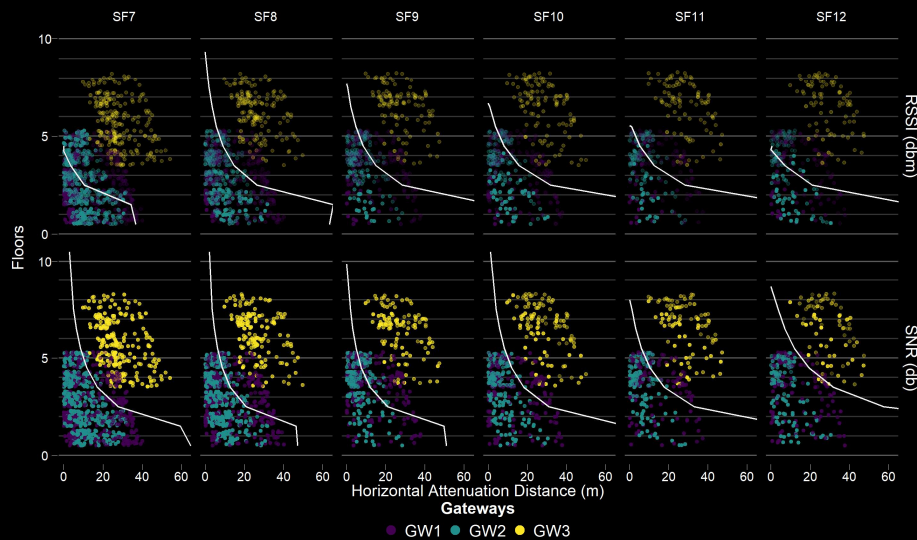
While several transmissions were received beyond our threshold, they had a much lower sign quality.

Note how gateway 3 lost more transmissions and

[C] indeed is outside of our model prediction.

[C] A gateway every 30m and 5 floors ensures signal quality and redundancy – in short the 30x5 rule.

## Transmissions compared to our mixed model



The Feasibility of Dense Indoor LoRaWAN Towards Passively Sensing Human Presence – Jascha Grübel

15.03.2021 27.2

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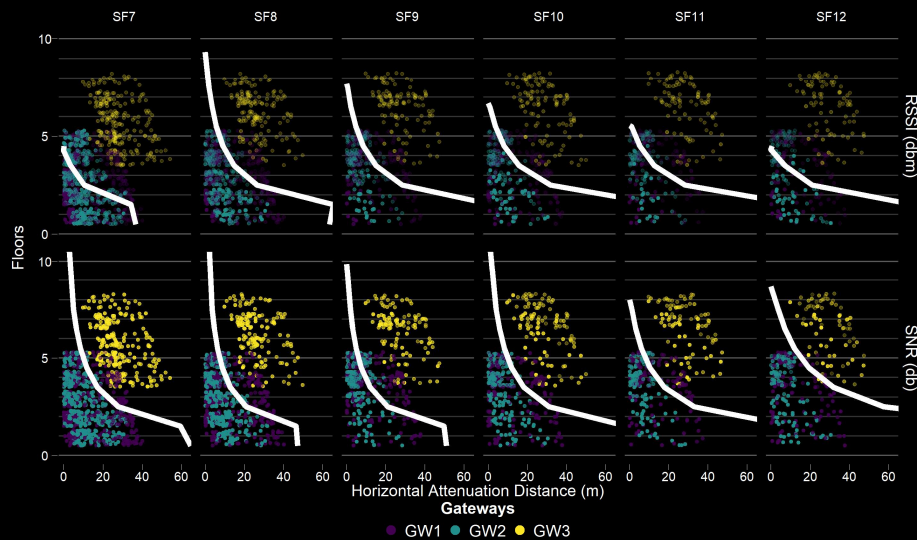
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## Transmissions compared to our mixed model



The Feasibility of Dense Indoor LoRaWAN Towards Passively Sensing Human Presence – Jascha Grübel

15.03.2021 27.3

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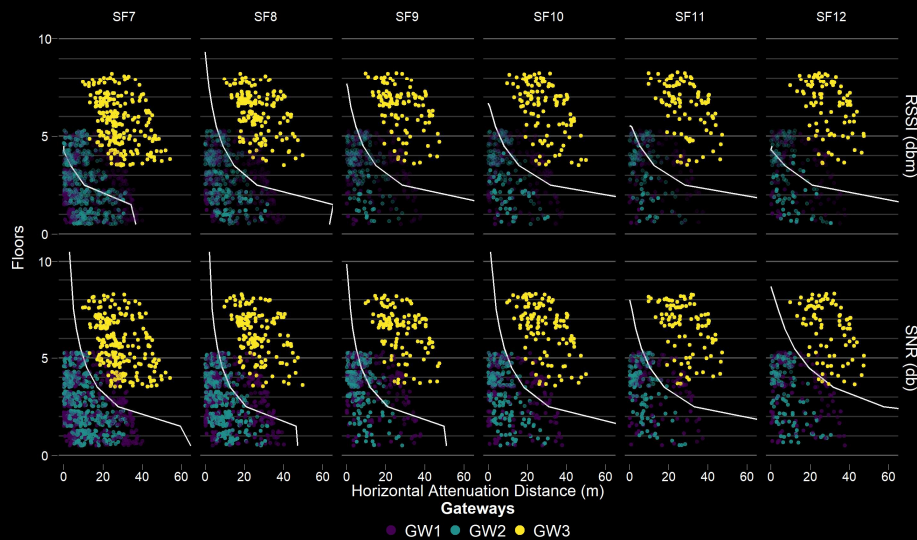
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## Transmissions compared to our mixed model



The Feasibility of Dense Indoor LoRaWAN Towards Passively Sensing Human Presence – Jascha Grübel

15.03.2021 27.4

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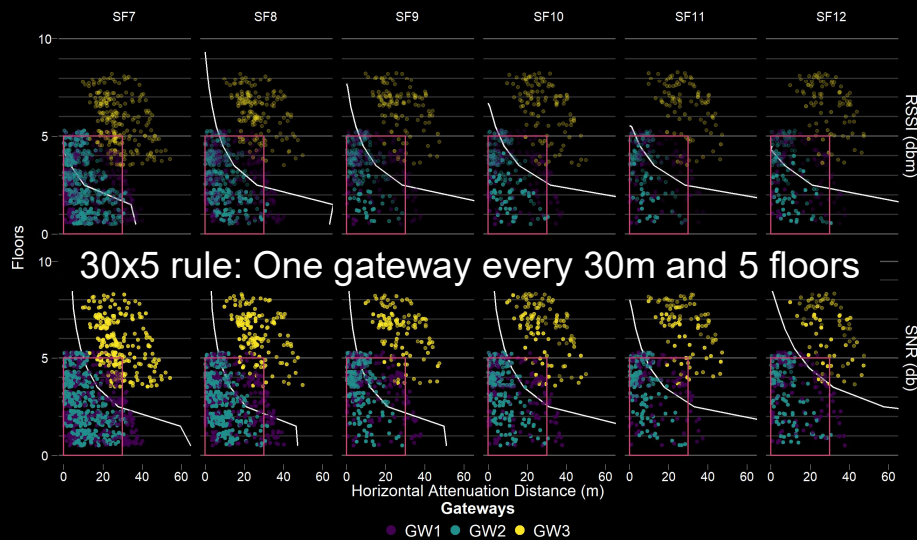
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## Transmissions compared to our mixed model



The Feasibility of Dense Indoor LoRaWAN Towards Passively Sensing Human Presence – Jascha Gröbel

15.03.2021 27.5

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## The feasibility of a LoRaWAN DISN

[C] We showed you how LoRaWAN can indeed scale up to the requirements of a dense indoor sensor network.

[C] We also showed that transmission distances indoors are much shorter than previous work claimed.

[C] However, it remains highly competitive with other technologies such as Wireless LAN that requires more power or Bluetooth that offers less coverage.

[C] In contrast to previous findings, the number of floors matter a lot.

[C] To sum up the results of our modelling, we recommend to use the 30x5-rule of placing one gateway every 30 meters and 5 floors.

[C] The model we used to arrive at these values is conservative because

[C] multipath-fading and signal shadowing are too complex to simulate or simplify.

[C] Therefore, in the real world, we actually achieve a better performance than our model.

But we want to ensure transmission quality and therefore stick with our conservative recommendation.

[C] We also investigated concurrent transmissions but in our setup they play no role yet.

Nonetheless, a trend is visible that may require action in even larger setups.

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## The feasibility of a LoRaWAN DISN

- LoRaWAN can scale up to a DISN
  - Transmission distances shorter than previously though
  - But comparable to WLAN with less power requirements
  - Floors heavily impact distances

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The Feasibility of Dense Indoor LoRaWAN Towards Passively Sensing Human Presence – Jascha Gröbel

15.03.2021 28.15

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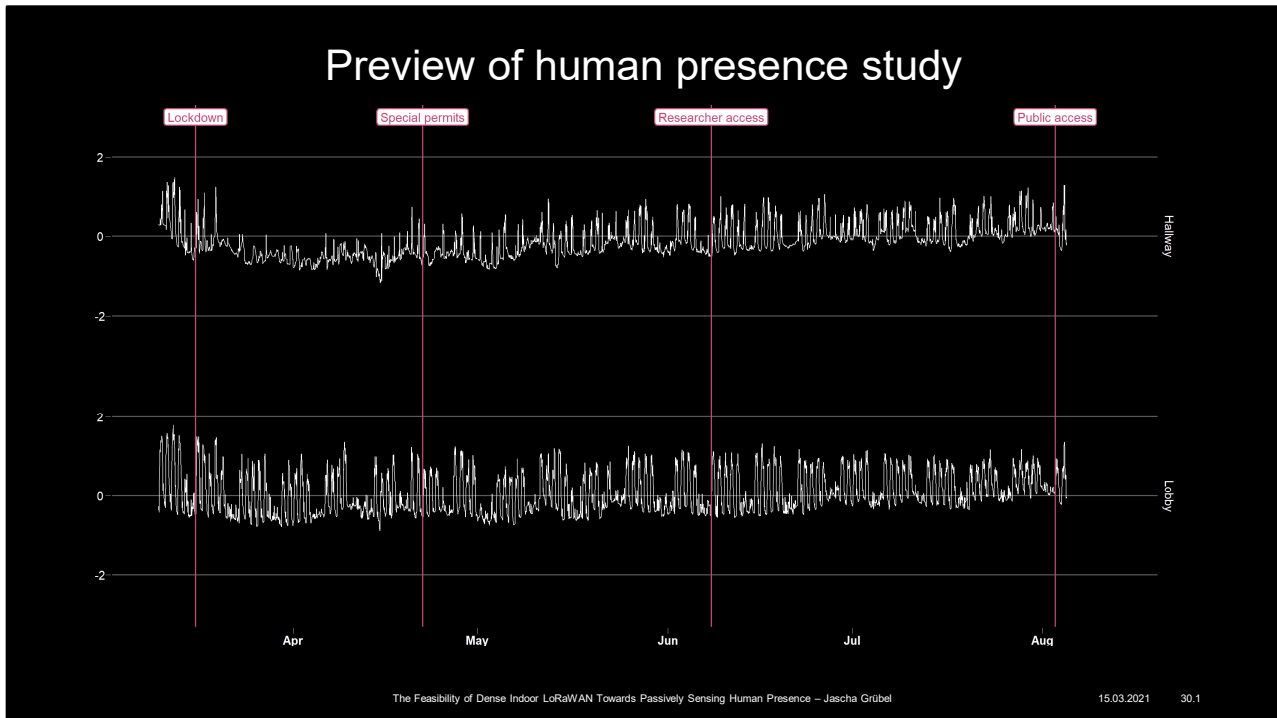
# Case Study

## Human Presence During COVID-19 Lockdown in Spring 2020

We established that LoRaWAN can be used to collect the data to study human presence.

However, we wanted to explore the data quality as well.

Since we do not have a ground truth for comparisons yet, we limit our selves to a small case study based on the Covid19-related lockdown in spring 2020.



We take the COVID-19 induced lockdown as a natural experiment influencing a variance indicator that summarizes the 23 million data points by room and hour.

The lockdown removed nearly all human activity from the building.

A reduction in variance should thus be caused by the absence of humans.

In turn, the absent component is consequently caused by human presence and not by environmental factors.

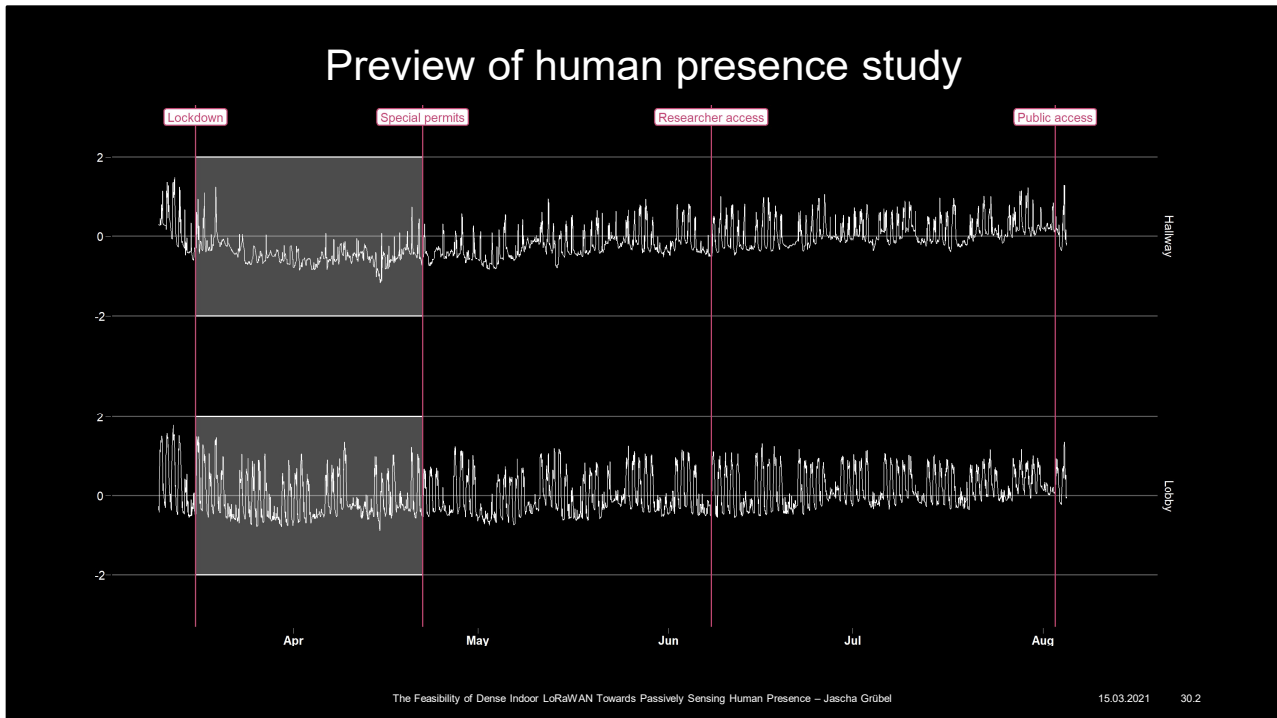
We compare this variance in an office hallway with the permanently staffed lobby where essential personal resided.

[C] During the lockdown, variation in the hallway reduces strongly in contrast to the steady pattern in the lobby.

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In contrast, the lobby has nearly the same cyclical pattern throughout the whole observation period.

If you are interested on more details on the human presence data, we can discuss this in the Q and A session that follows.



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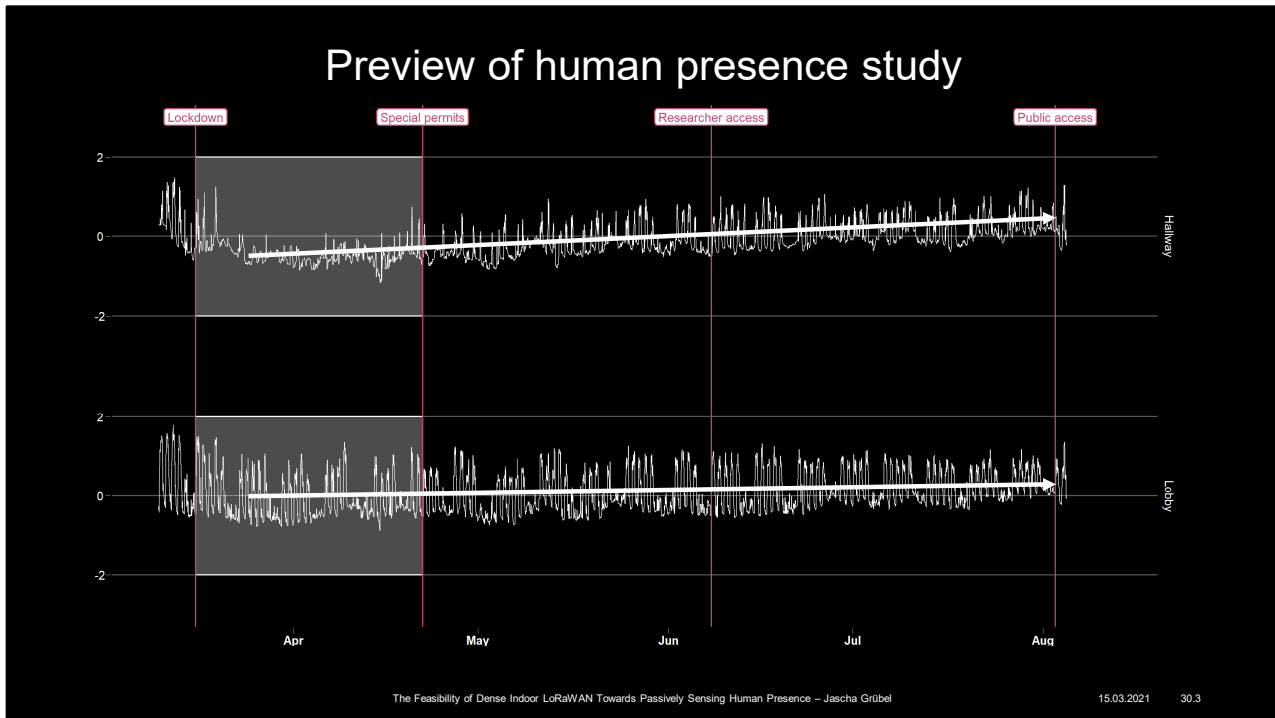
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# The Feasibility of Dense Indoor LoRaWAN Towards Passively Sensing Human Presence

Jascha Grübel<sup>1</sup>, Tyler Thrash<sup>2</sup>, Didier Hélat<sup>3</sup>, Robert W. Sumner<sup>1</sup>, Christoph Hölscher<sup>1</sup>, Victor R. Schinazi<sup>4</sup>

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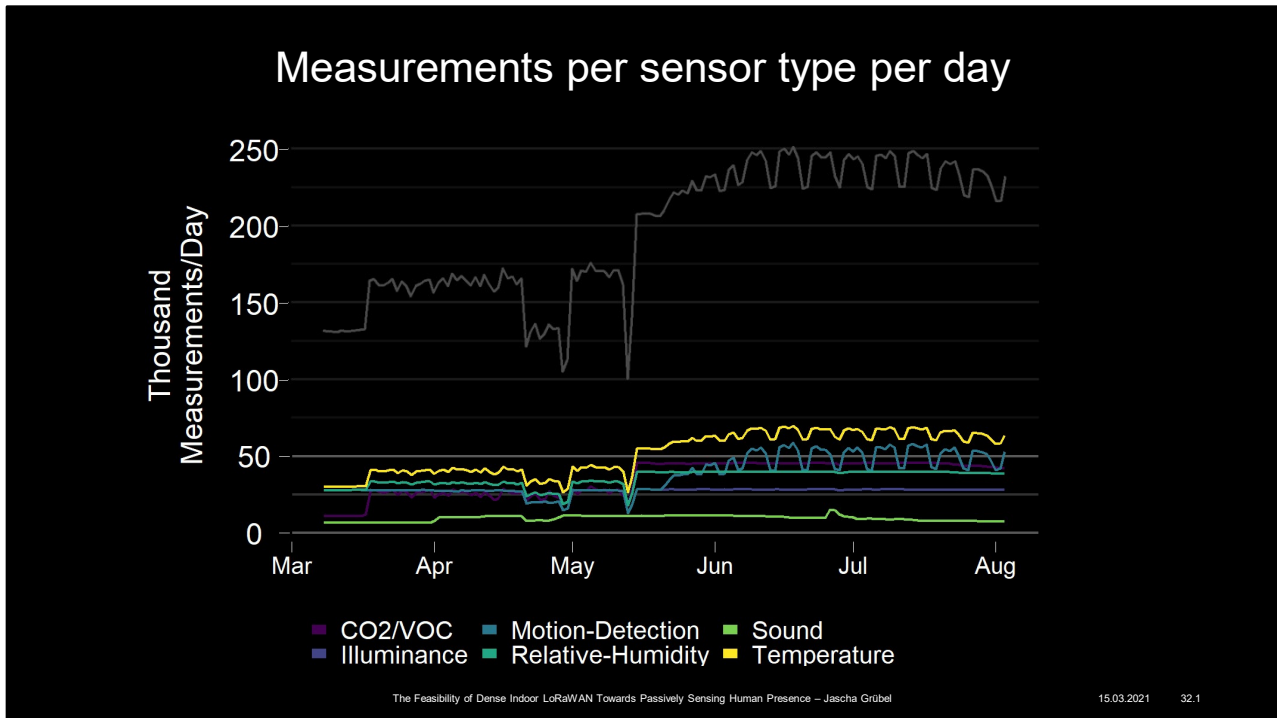
<sup>4</sup>Bond University, Robina, Australia



Presentation available here: [10.5281/zenodo.4605350](https://zenodo.org/record/4605350)

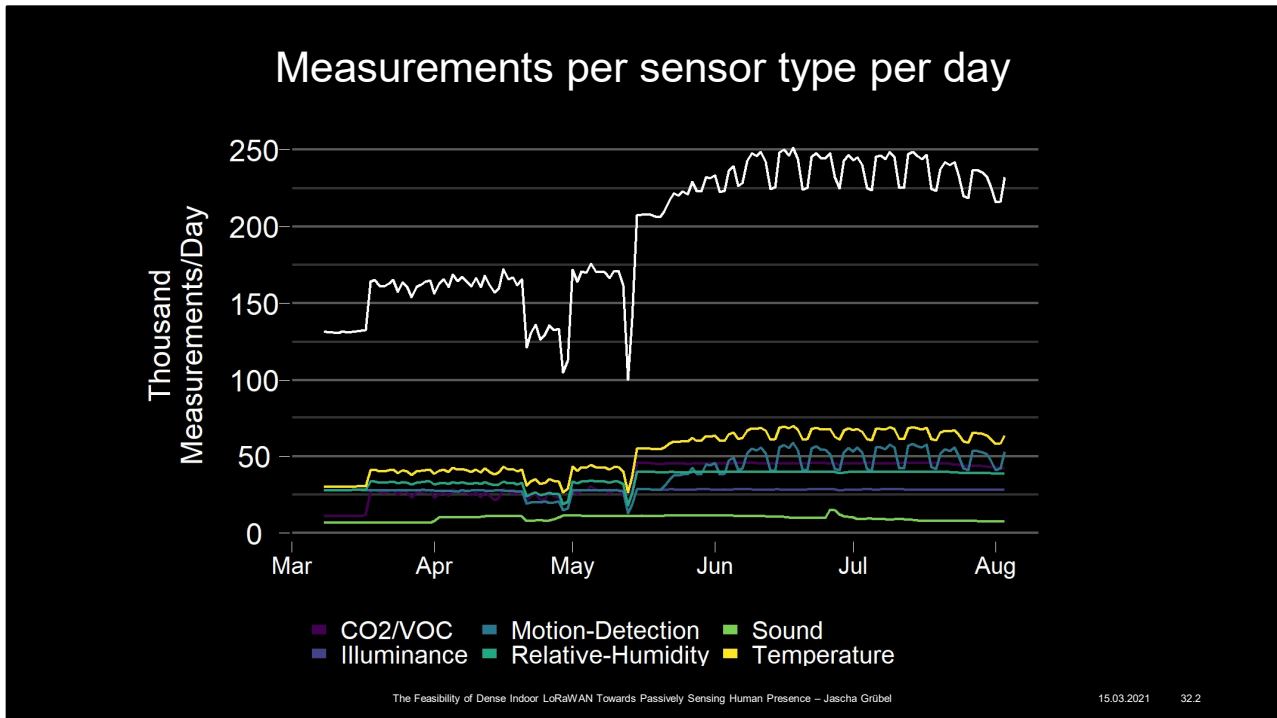
To conclude, our proof of concept goes beyond simulations to demonstrate the effective application of LoRaWAN indoors and offers us a way towards passively sensing human presence indoors.

We also introduce the 30x5 rule for how to place gateways indoors for dense indoor sensor networks to ensure signal quality and redundancy.

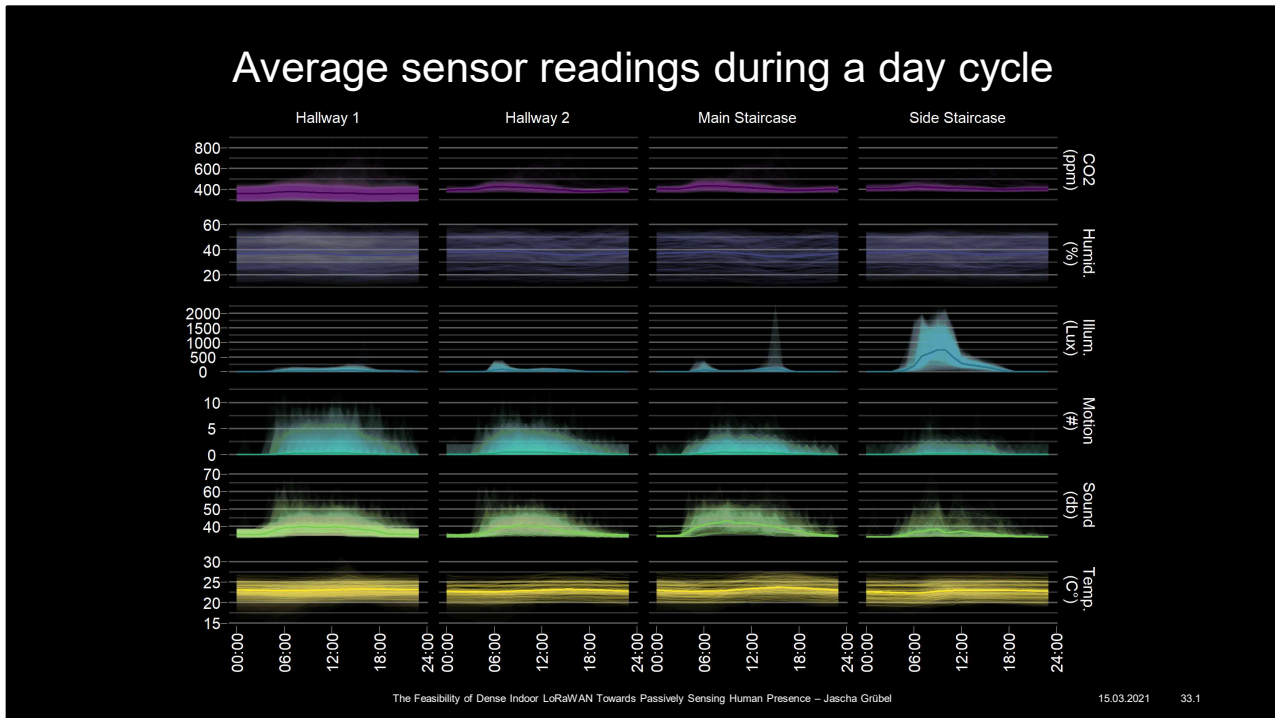


Let me start by giving you an overview of the number of measurements by sensor type and day during the 5 months of data collection for this paper. Sensors are grouped and colored by 6 types listed at the bottom. The sum of all measurements is shown in white. The ramp-up of the data collection was delayed as installation had to take place in stages due to the Covid10-related lockdown. Currently, the system collect up to 250 thousand data points per day since March 2020 and probably at least until December 2021.





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Before we look at the connection to human presence, let's peek at the data variation.

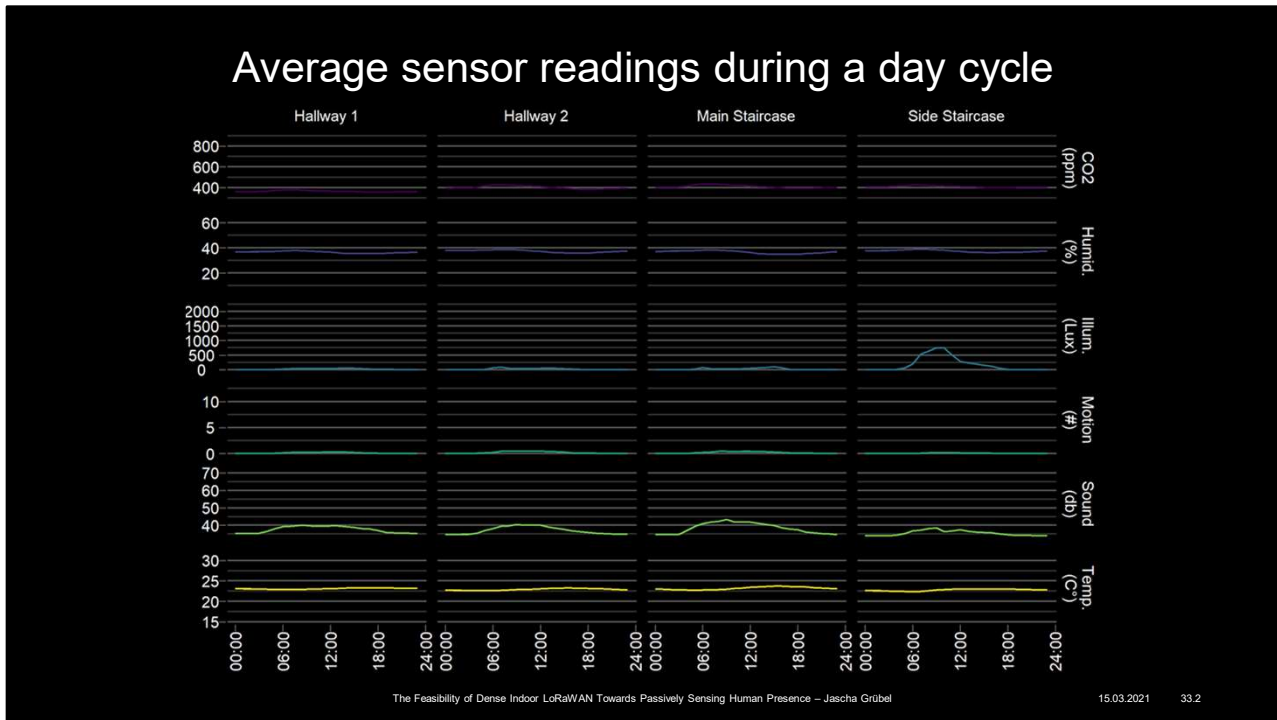
Here we show the average sensor readings for selected rooms and sensor types.

Each line represents a single day's sensor reading.

The thick line represents the average day.

The variation may be driven by both human activity and environmental factors.

For instance, the spike in illuminance in the side staircase is caused by the afternoon sun and not the hallway lamps.



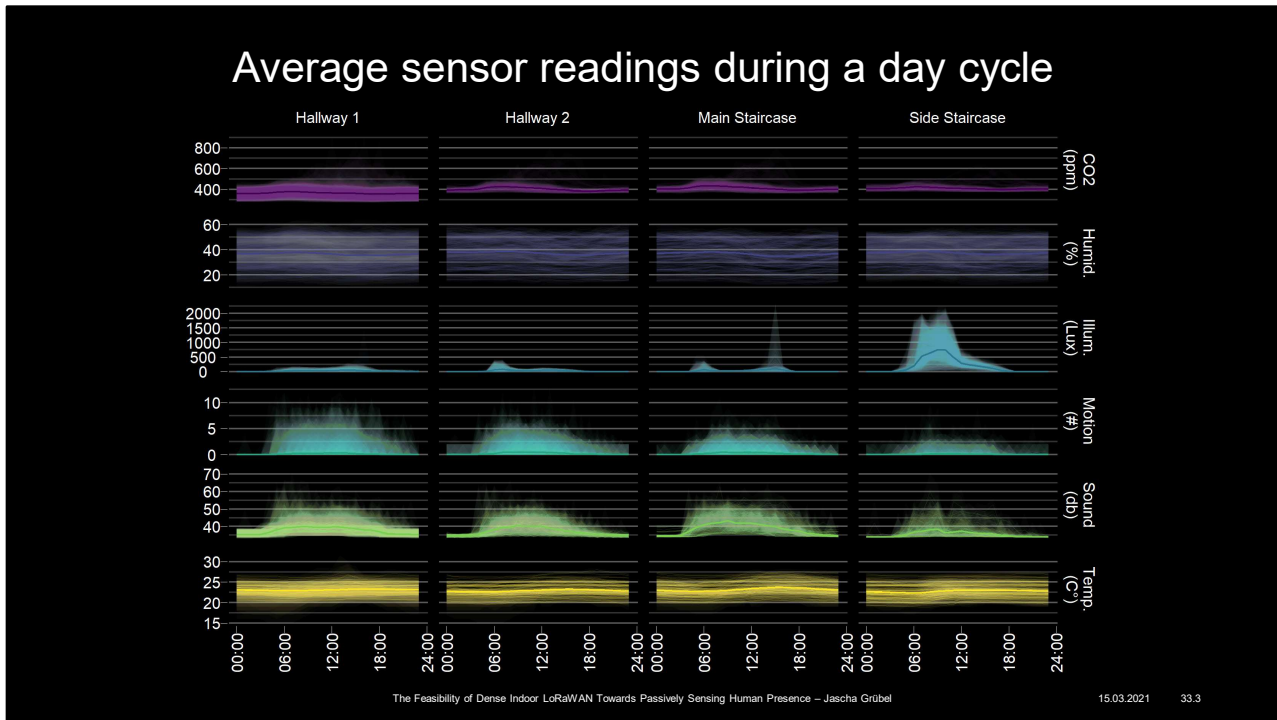
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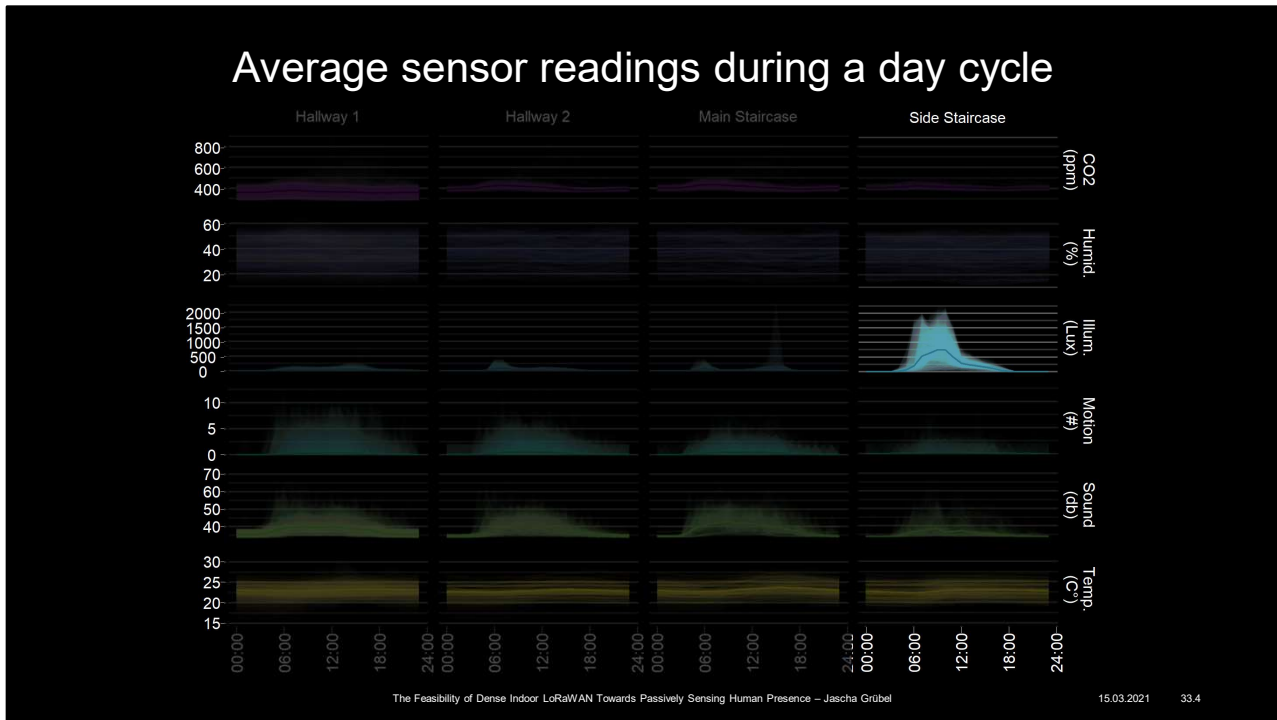
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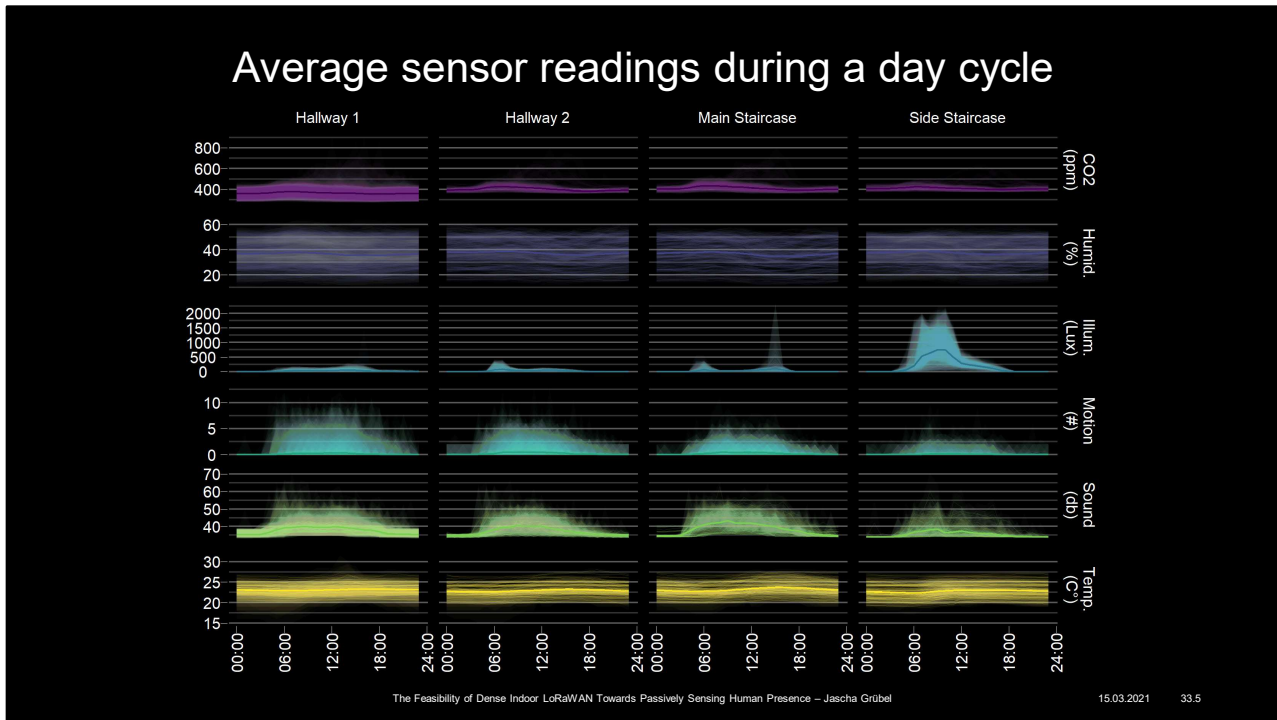
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## Variance indicator

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15.03.2021 34.1

To understand the overall variation, we construct a variance indicator that summarized the sensor data every hour by room across all sensors. We z-score the variance with a per sensor type mean. We also fence the data to three standard deviations because extraordinary events like construction sometimes drove the standard deviation beyond 10000.

## Variance indicator

We compute an hourly room variance

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## Mixed Model Fixed Effects coefficients

TABLE IV  
MIXED MODELS TO DETERMINE SNR AND RSSI FOR EACH DATA RATE

	SF7		SF8		SF9		SF10		SF11		SF12	
	SNR	RSSI	SNR	RSSI	SNR	RSSI	SNR	RSSI	SNR	RSSI	SNR	RSSI
Average signal strength at node (constant)	10.03* (0.09)	-63.75* (0.46)	10.35* (0.23)	-94.75* (0.61)	10.00* (0.29)	-97.33* (0.64)	8.07* (0.35)	-87.07* (0.91)	10.45* (0.36)	-85.05* (0.90)	8.38* (0.43)	-60.35* (0.77)
Attenuation in m	-0.27* (0.00)	-1.61* (0.00)	-0.43* (0.00)	-0.49* (0.00)	-0.44* (0.00)	-0.45* (0.00)	-0.32* (0.00)	-0.55* (0.00)	-0.34* (0.01)	-0.61* (0.01)	-0.20* (0.01)	-1.09* (0.01)
One floor between	-0.26* (0.00)	-9.48* (0.01)	0.04 (0.03)	-1.92* (0.03)	-0.92* (0.04)	-2.89* (0.03)	-0.96* (0.05)	-5.29* (0.04)	-2.50* (0.07)	-7.10* (0.06)	-2.68* (0.08)	-14.86* (0.08)
Floor-attenuation interaction	-0.01* (0.00)	0.29* (0.00)	0.02* (0.00)	0.07* (0.00)	0.04* (0.00)	0.08* (0.00)	0.02* (0.00)	0.12* (0.00)	0.04* (0.00)	0.15* (0.00)	0.02* (0.00)	0.29* (0.00)
Colliding message	0.13* (0.01)	1.57* (0.05)	0.17 (0.28)	0.67 (0.28)	0.24 (0.44)	0.66 (0.34)	0.77 (0.43)	0.36 (0.36)	1.37* (0.29)	0.27 (0.25)	0.63 (0.21)	0.27 (0.21)
Observations	12,948,936	12,948,936	495,967	495,967	246,184	246,184	160,618	160,618	104,499	104,499	106,025	106,025

\*p<0.001

Most transmissions arrived, only few are lost as many could be restored from neighbouring gateways. Multiple gateways improve reception but have diminishing returns beyond 30m.

## Mixed Model Maximal Transmission Distances

TABLE V  
SNR AND RSSI LIMITS FOR TRANSMISSION IN OUR SYSTEM BASED ON MIXED MODELS

Max. reachable	SNR						RSSI					
	SF7	SF8	SF9	SF10	SF11	SF12	SF7	SF8	SF9	SF10	SF11	SF12
Distance 0 floors up	64.88 m	47.29 m	50.96 m	72.6 m	83.34 m	141.84 m	36.81 m	63.49 m	71.1 m	82.14 m	79.3 m	69.65 m
Distance 1 floor up	59.5 m	46.39 m	49.73 m	70.87 m	82.73 m	141.59 m	34.36 m	65.4 m	74.49 m	88.78 m	85.46 m	72.69 m
Distance 2 floors up	27.85 m	20.96 m	21.01 m	30.98 m	33 m	57.66 m	10.4 m	26.48 m	28.42 m	31.8 m	28.34 m	21 m
Distance 3 floors up	17.19 m	12.76 m	11.96 m	18.26 m	17.79 m	31.89 m	3.43 m	14.72 m	14.9 m	15.72 m	12.6 m	7.1 m
Distance 4 floors up	11.84 m	8.7 m	7.53 m	11.99 m	10.43 m	19.38 m	0.11 m	9.03 m	8.44 m	8.13 m	5.24 m	0.64 m
Distance 5 floors up	8.61 m	6.29 m	4.89 m	8.27 m	6.07 m	11.99 m	-*	5.69 m	4.66 m	3.71 m	0.96 m	-*
Floors	14.82	15.25	9.87	11.74	8	8.68	4.26	9.33	7.68	6.68	5.55	4.31

Note:

\* No meaningful output.

Most transmissions arrived, only few are lost as many could be restored from neighbouring gateways. Multiple gateways improve reception but have diminishing returns beyond 30m.



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