

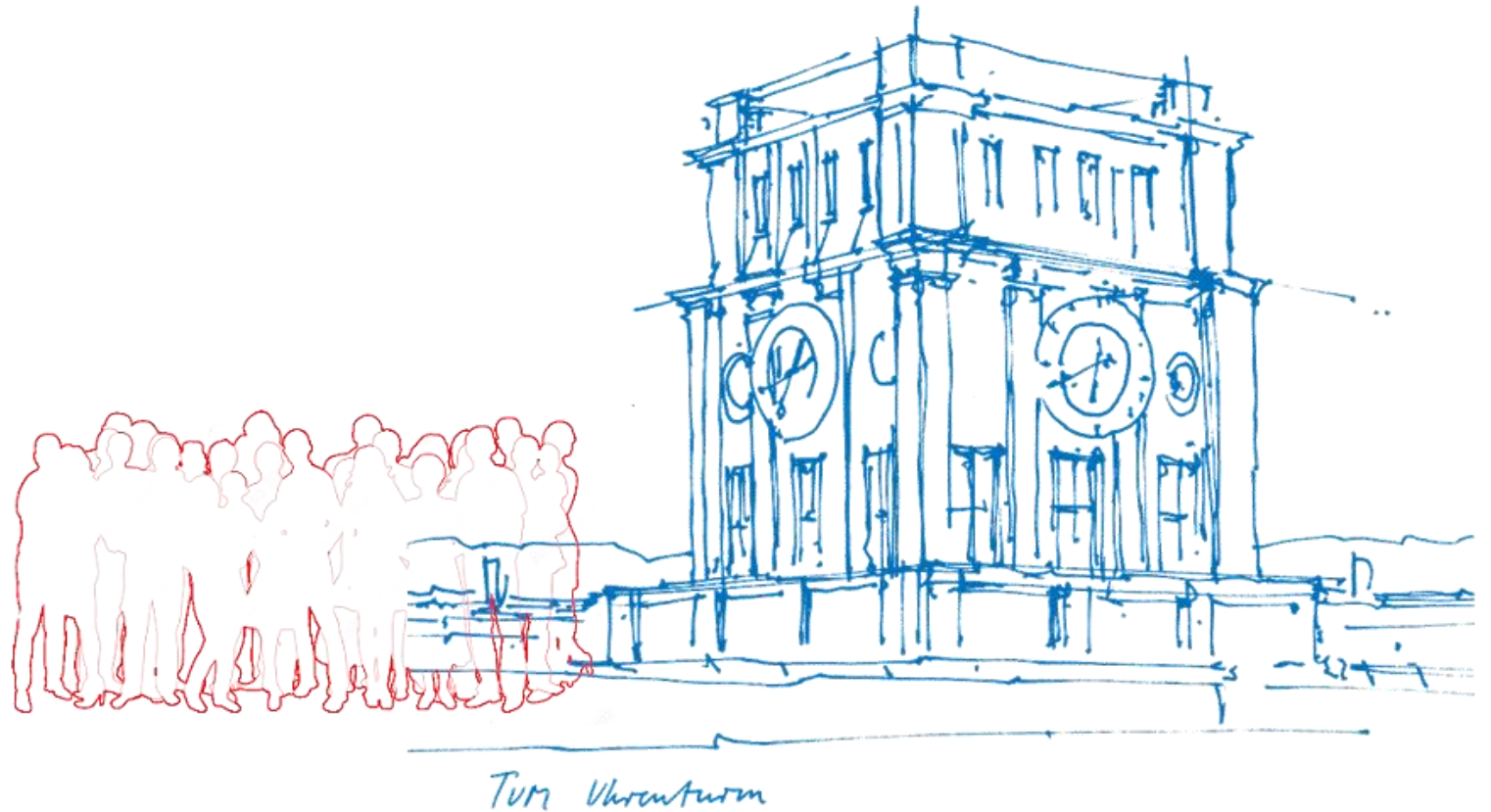
# Crowd management based on direct communication technology

Christina Maria Mayr

Doctoral Defense

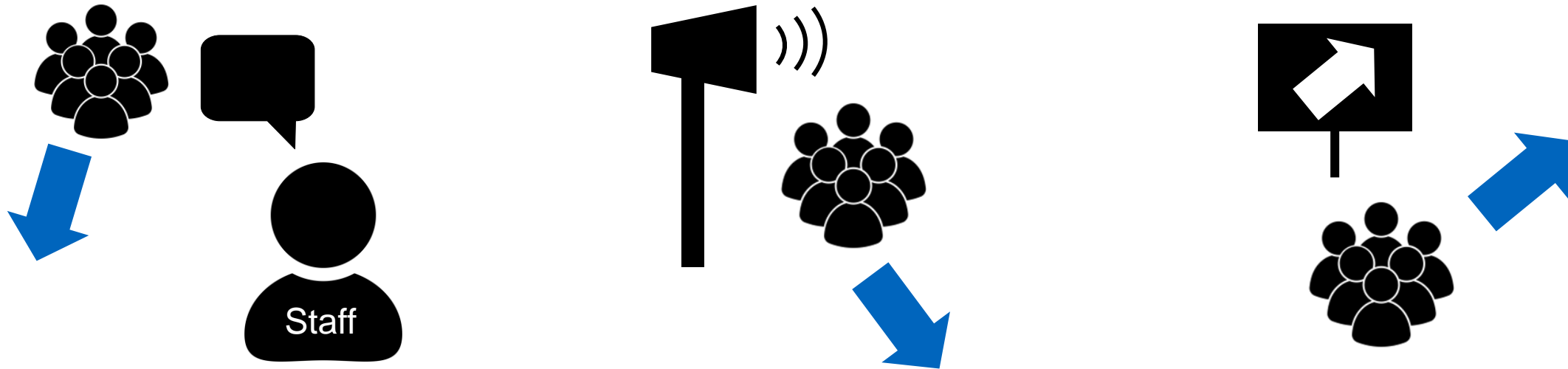
10th July, 2024

Technical University of Munich  
Hochschule München University of  
Applied Sciences



# Crowd management ensures safety and comfort

Several approaches are used in practice [1]



# Infrastructure is often missing at transportation hubs

Inform the crowd through mobile applications?



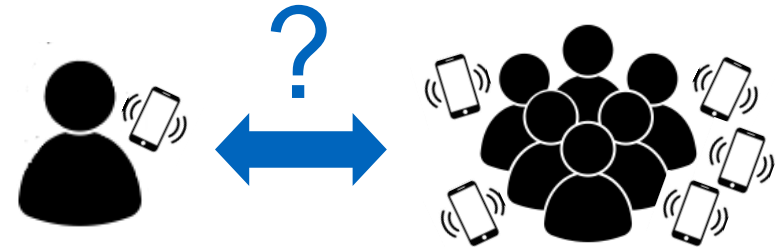
Images: Wolfram Schlenker, rights granted



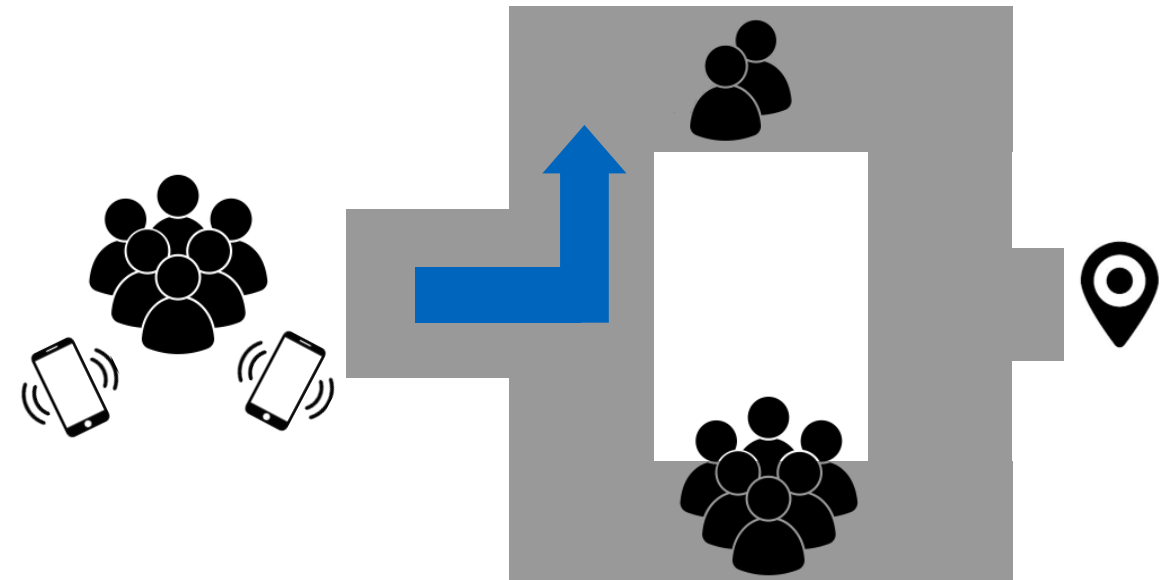
# Direct communication for crowd management applications?

Vehicles exchange data through direct communication technologies.

Example: IEEE 802.11p [2]

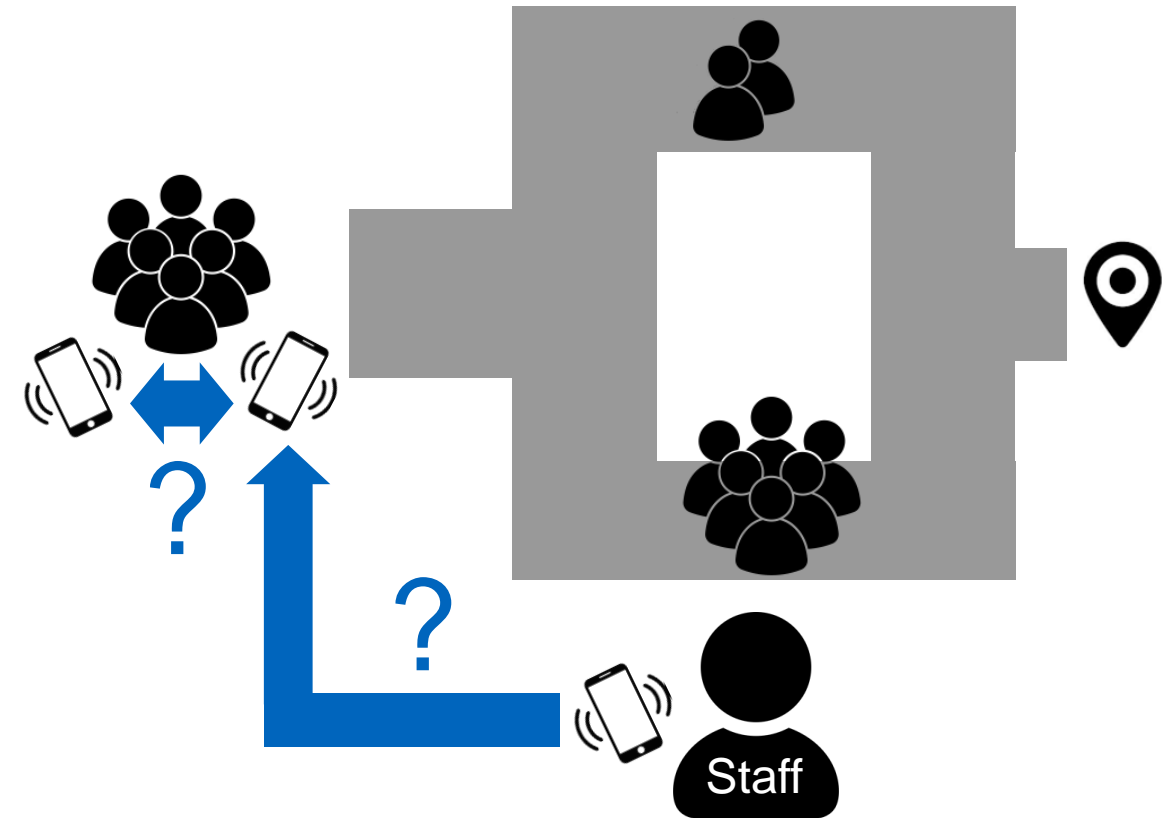


# How can crowds be redirected with mobile applications based on direct communication technology?



# How can crowds be redirected with mobile applications based on direct communication technology?

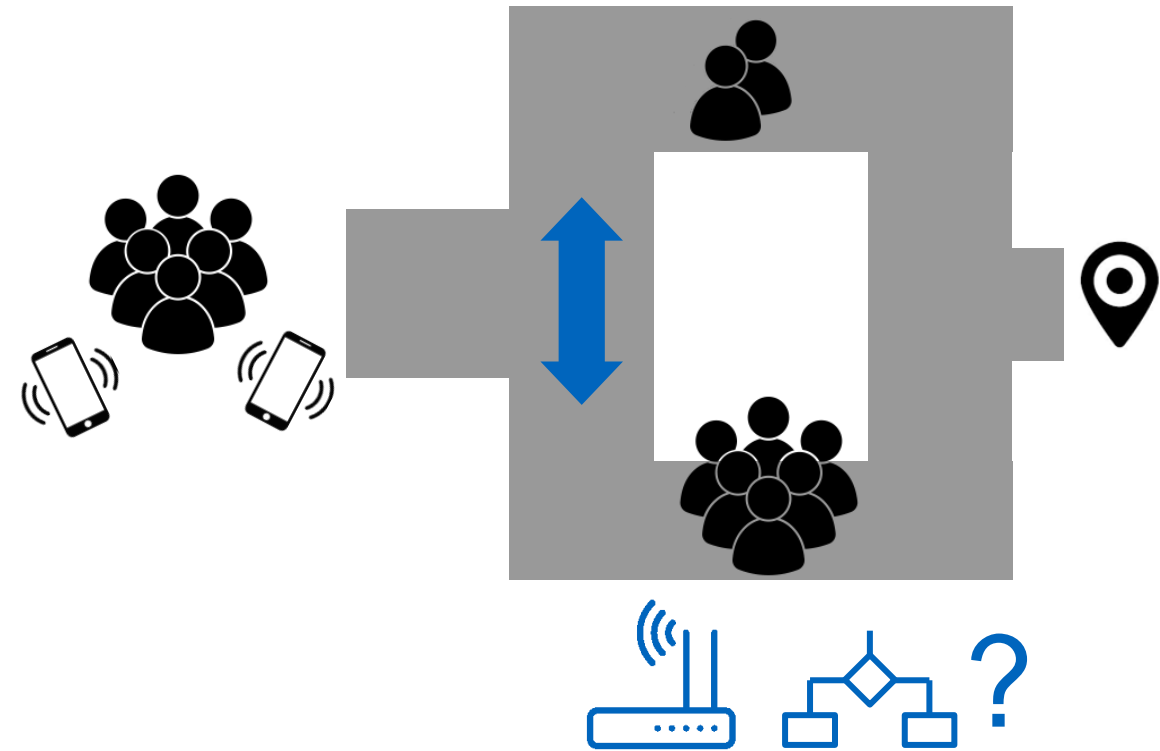
Direct communication technology:  
Does the information dissemination work?



# How can crowds be redirected with mobile applications based on direct communication technology?

Direct communication technology:  
Does the information dissemination work?

Route recommendation algorithm:  
Which one is suitable?

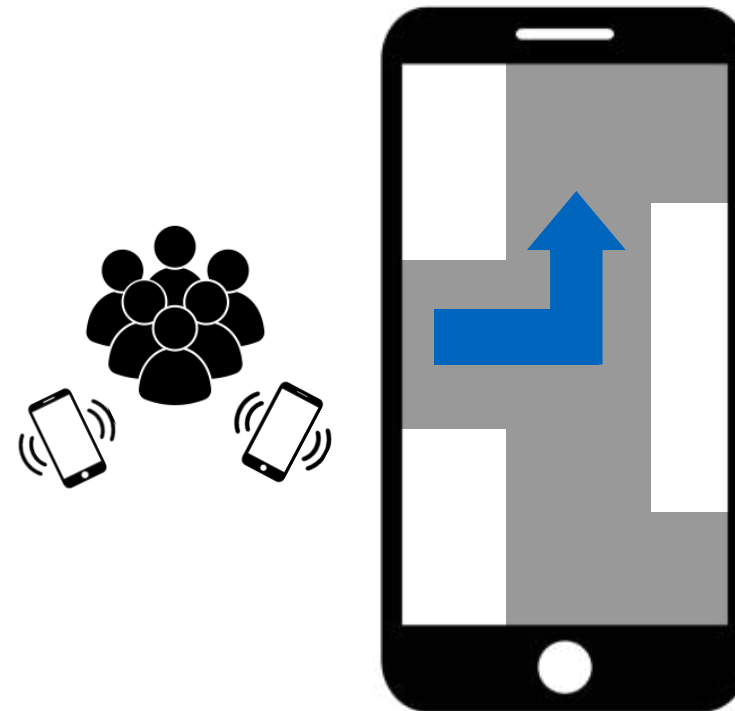


# How can crowds be redirected with mobile applications based on direct communication technology?

Direct communication technology:  
Does the information dissemination work?

Route recommendation algorithm:  
Which one is suitable?

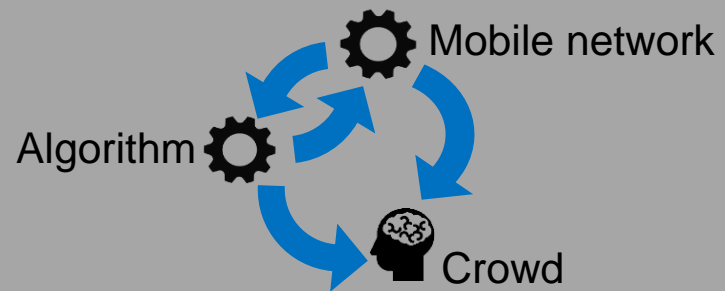
Crowd:  
How to design messages to foster compliance?








# Focus of today

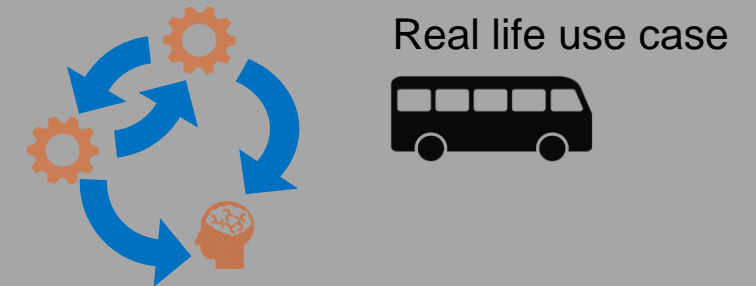
## Novel socio-technical system



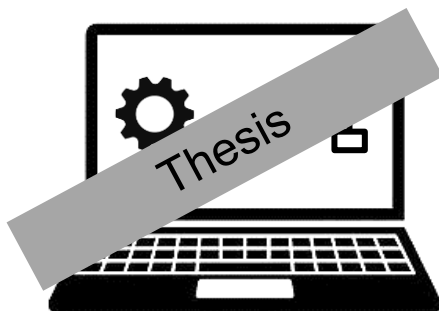
## Component investigation

-  Algorithm  
*Modeling & Simulation*
-  Mobile network  
*Modeling & Simulation*
-  Crowd behavior  
*Survey*

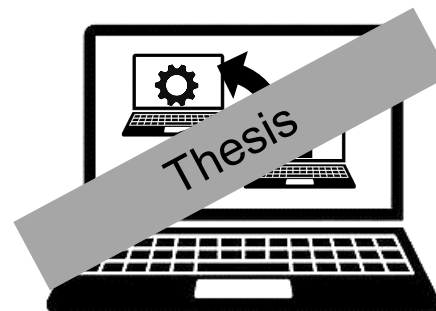
## Proof of concept



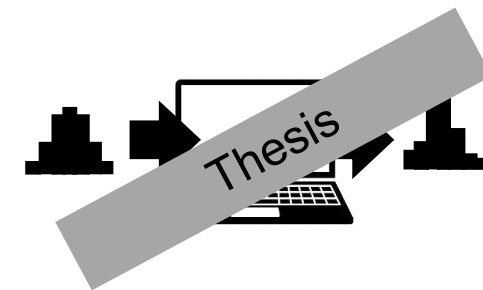
## Novel simulator flowcontrol



## Novel simulator CrowNet

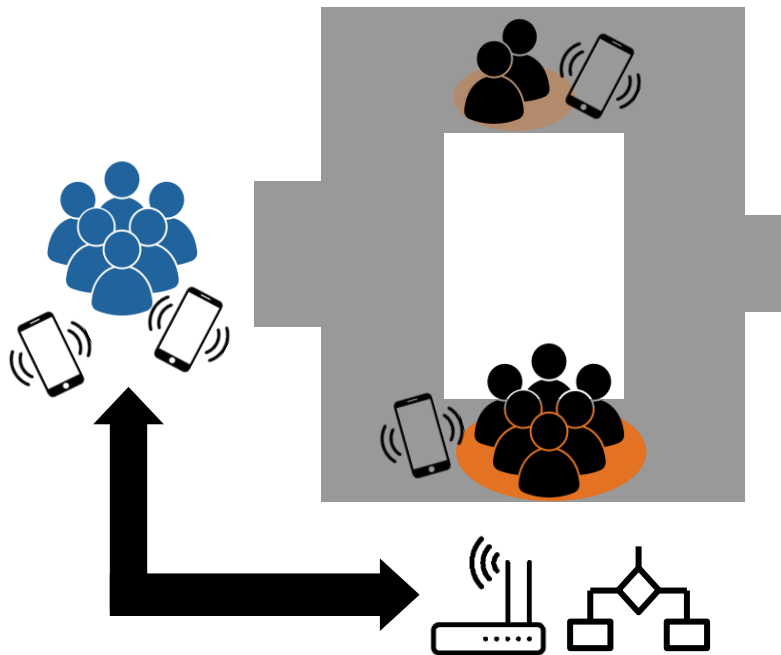


## Uncertainty of parameters



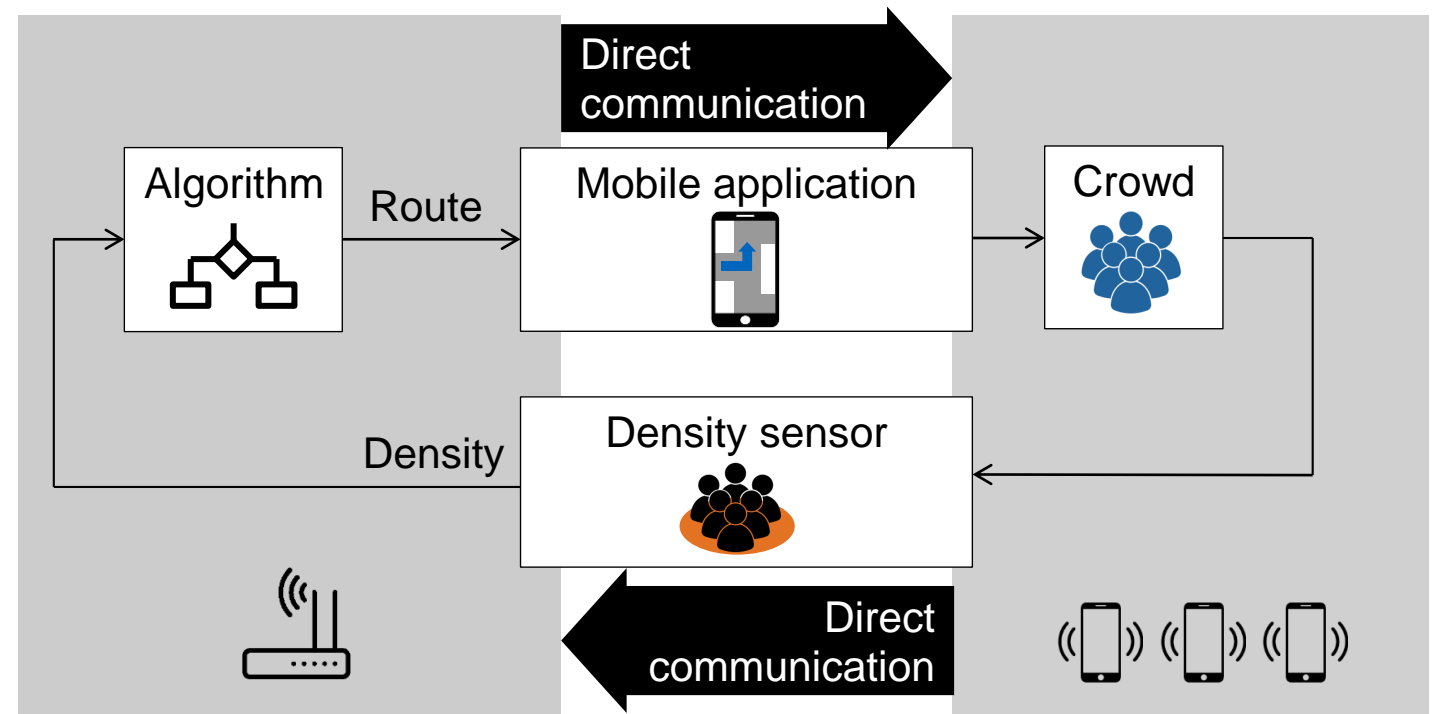
# Novel model of a crowd guidance system

## Map perspective

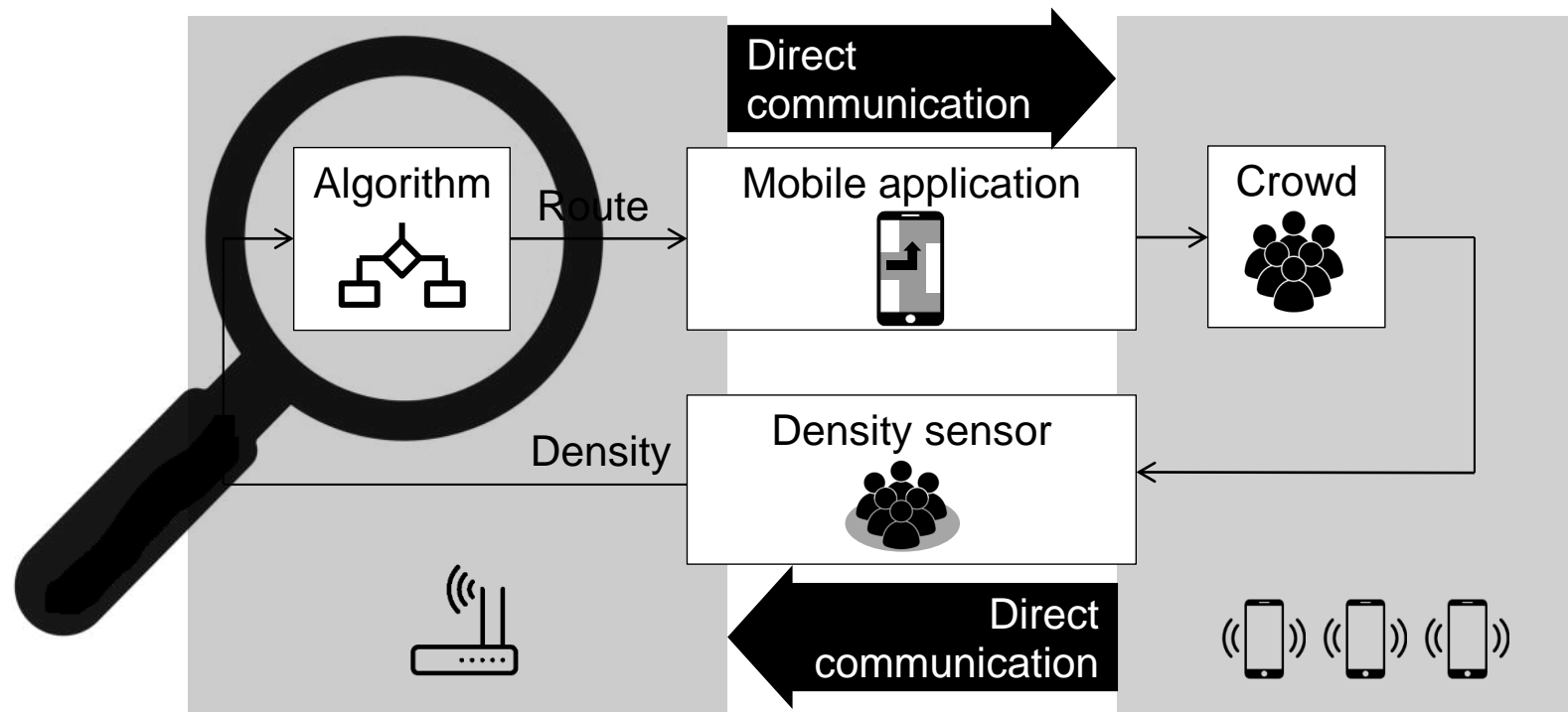


## System perspective

See Fig. 3.1 & 4.27 of my thesis



# Which route recommendation algorithm is suitable?



# Algorithms have been designed for fully controllable fluids – a crowd does not behave like a fluid!

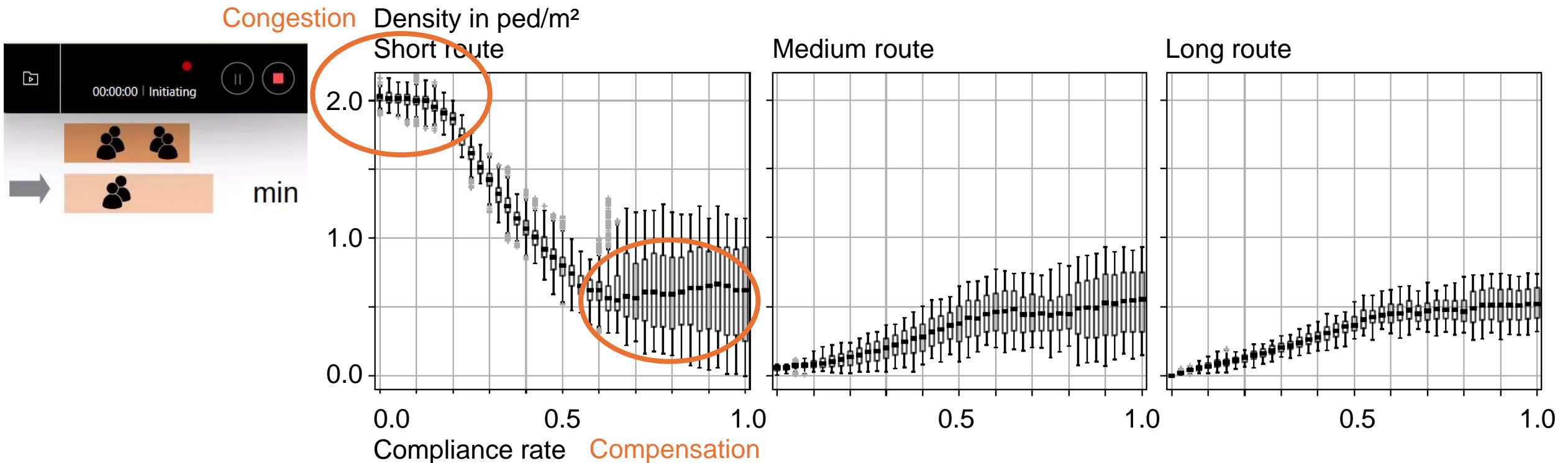
State-of-the-art algorithms:

Proportional Integral control [7], On-Off-control [8], State-space control [9-12], Model predictive control [13], ...



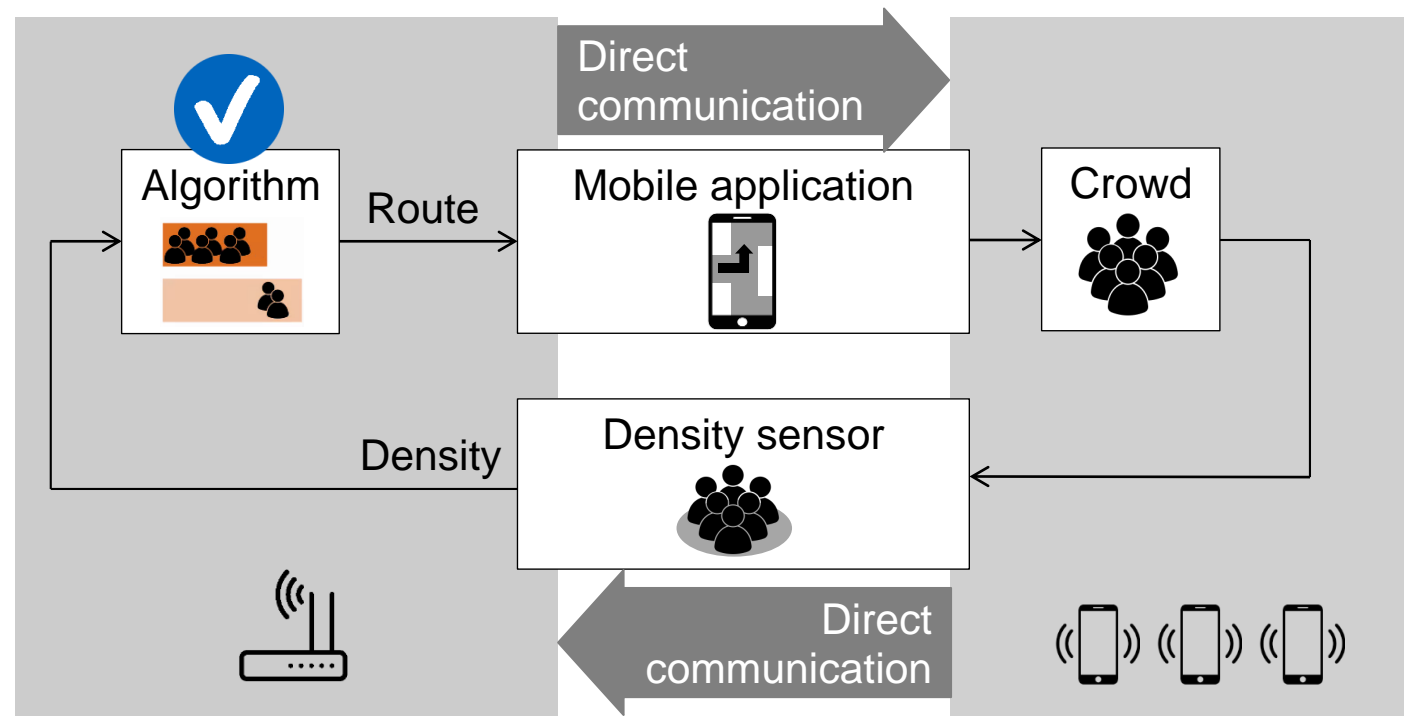
# Recommend the route where the density is the lowest

My algorithm resolves congestion and compensates missing compliance [6]



# A density-based algorithm successfully resolves congestion

Detailed comparison of algorithms:  
See my publication “Guiding ...” [6]





# Testing direct communication under worst case conditions

## Simple technology

### WLAN

IEEE 802.11p  
[2]

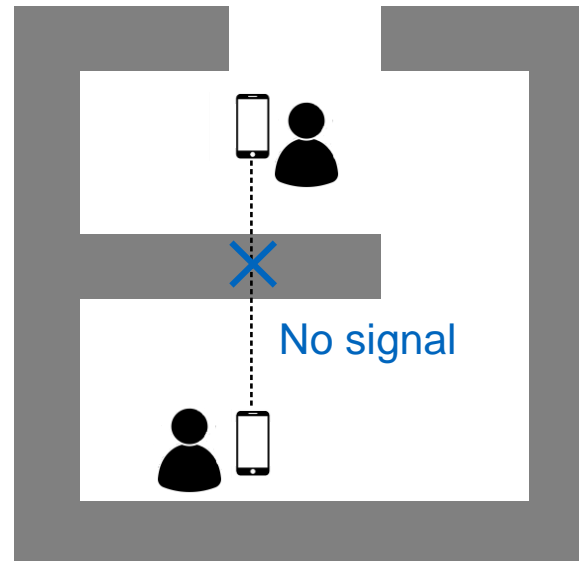
IEEE 802.11bd  
[14]

### Cellular

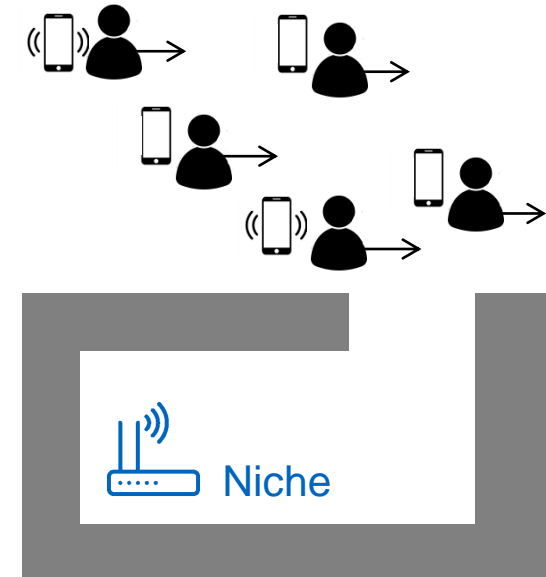
LTE V2X  
[15-19]

5G V2X  
[20-26]

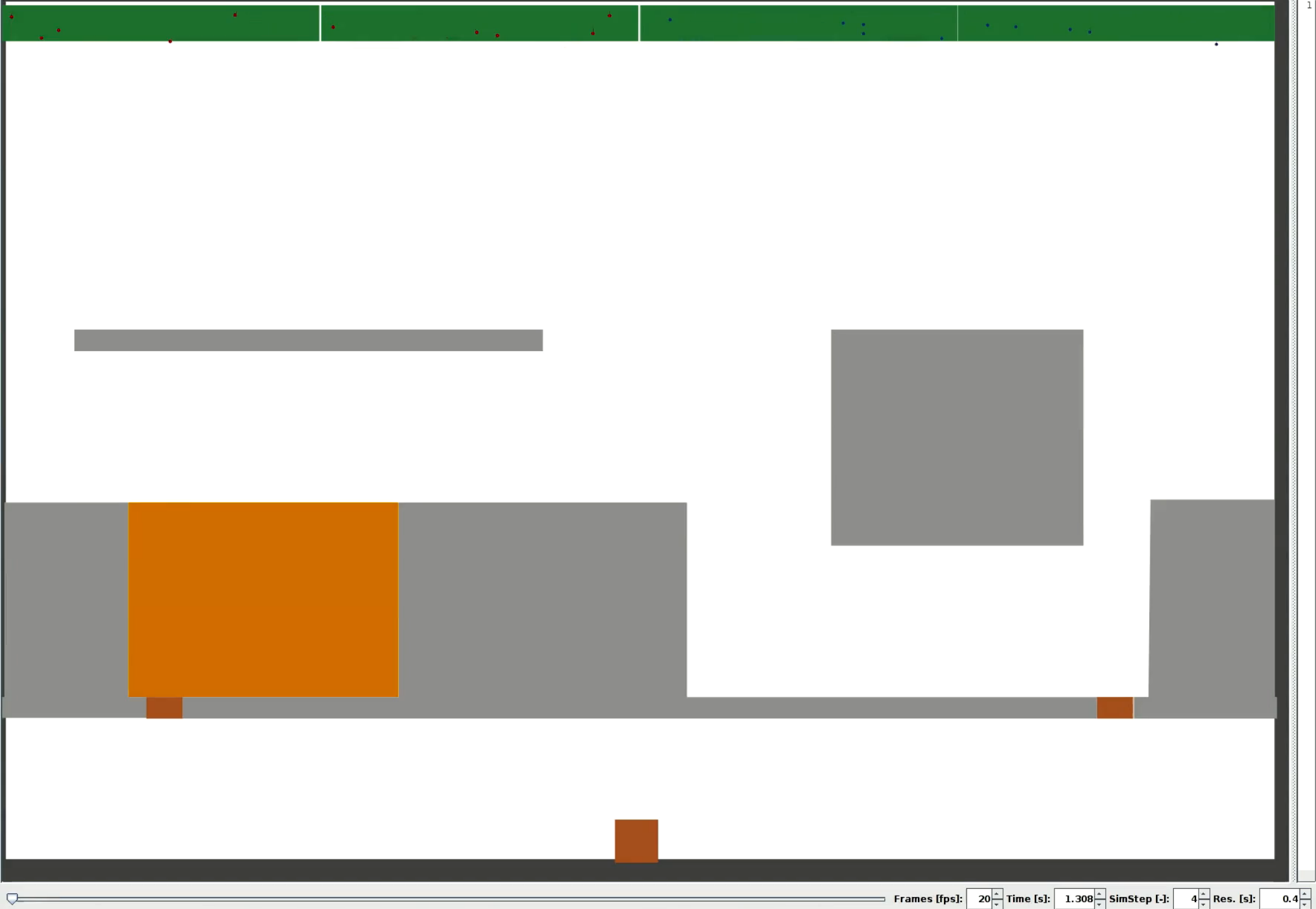
## Extreme signal modeling



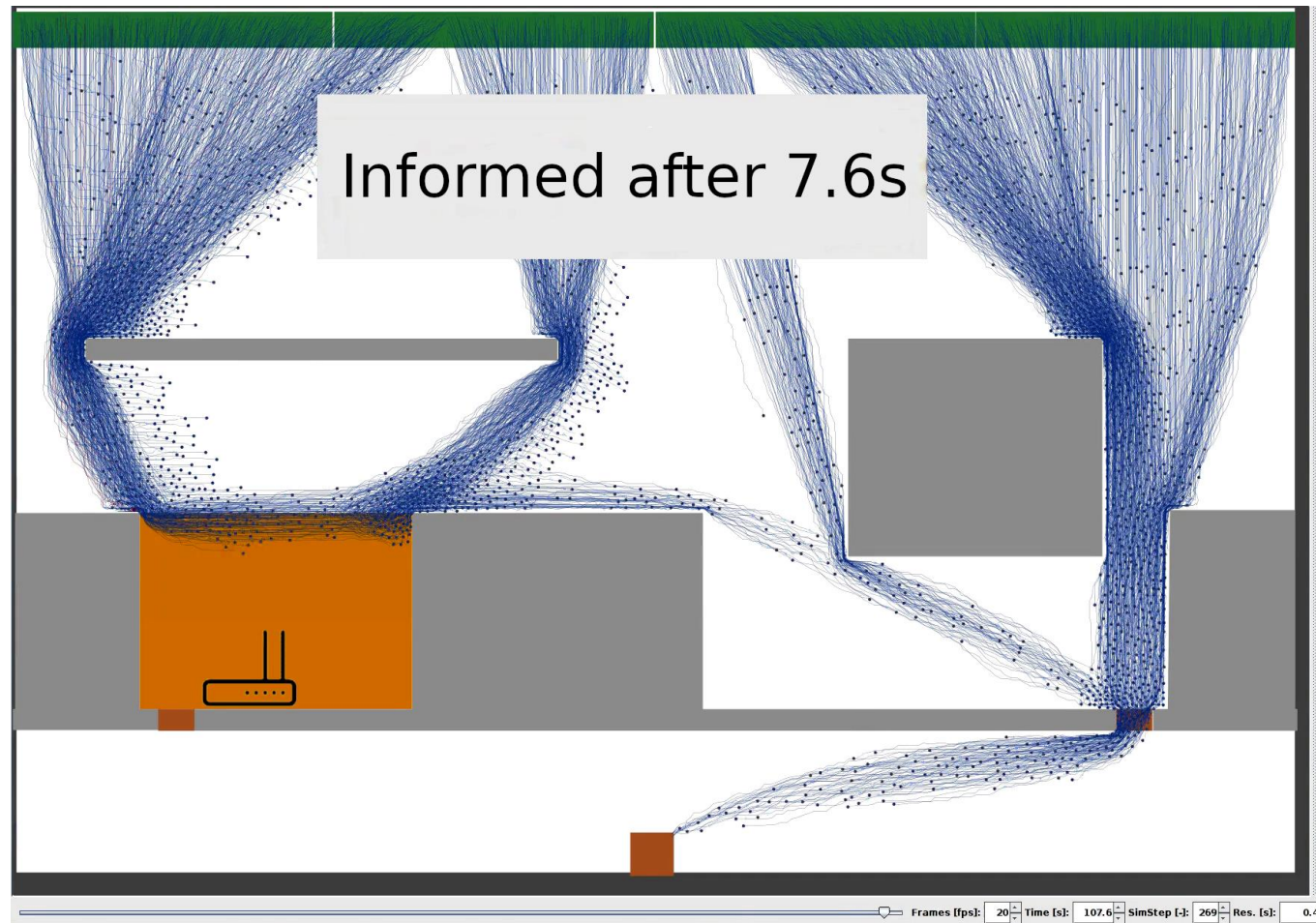
## Scenario







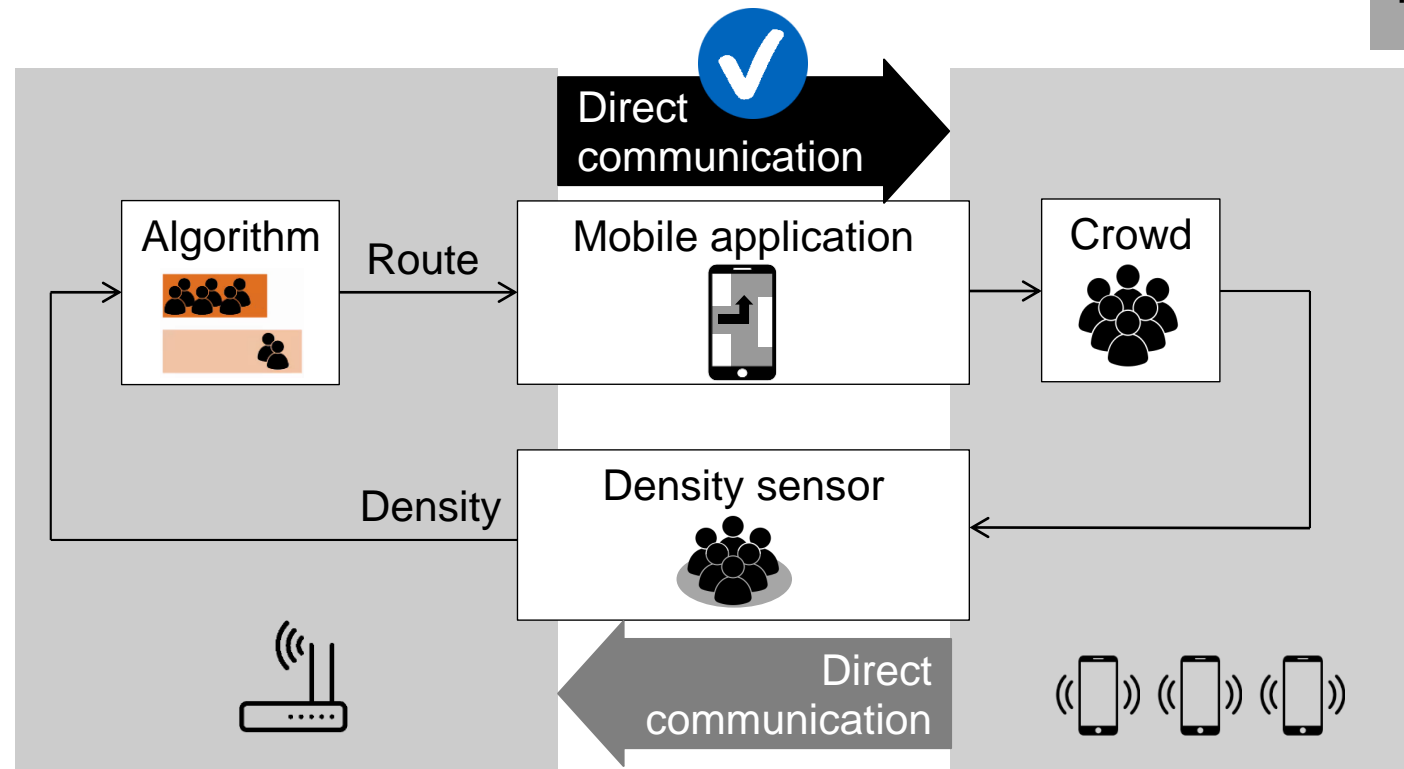
# The crowd is successfully informed after several seconds



Parameter studies:  
See my publication  
“Analysis of info ...” [27]

# Direct communication is suitable for redirecting crowds

Parameter studies:  
See my publication  
“Analysis of info ...” [27]



# How to design mobile messages to foster compliance?

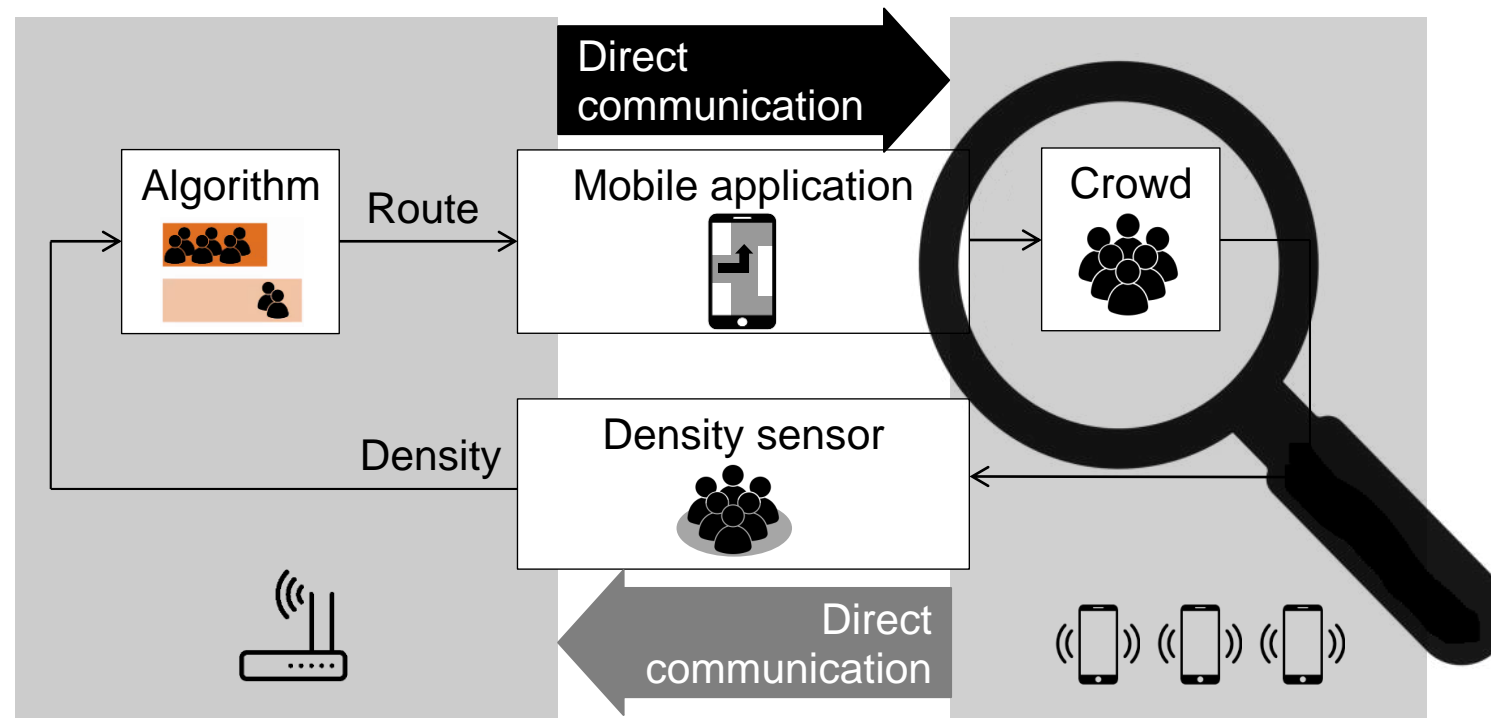
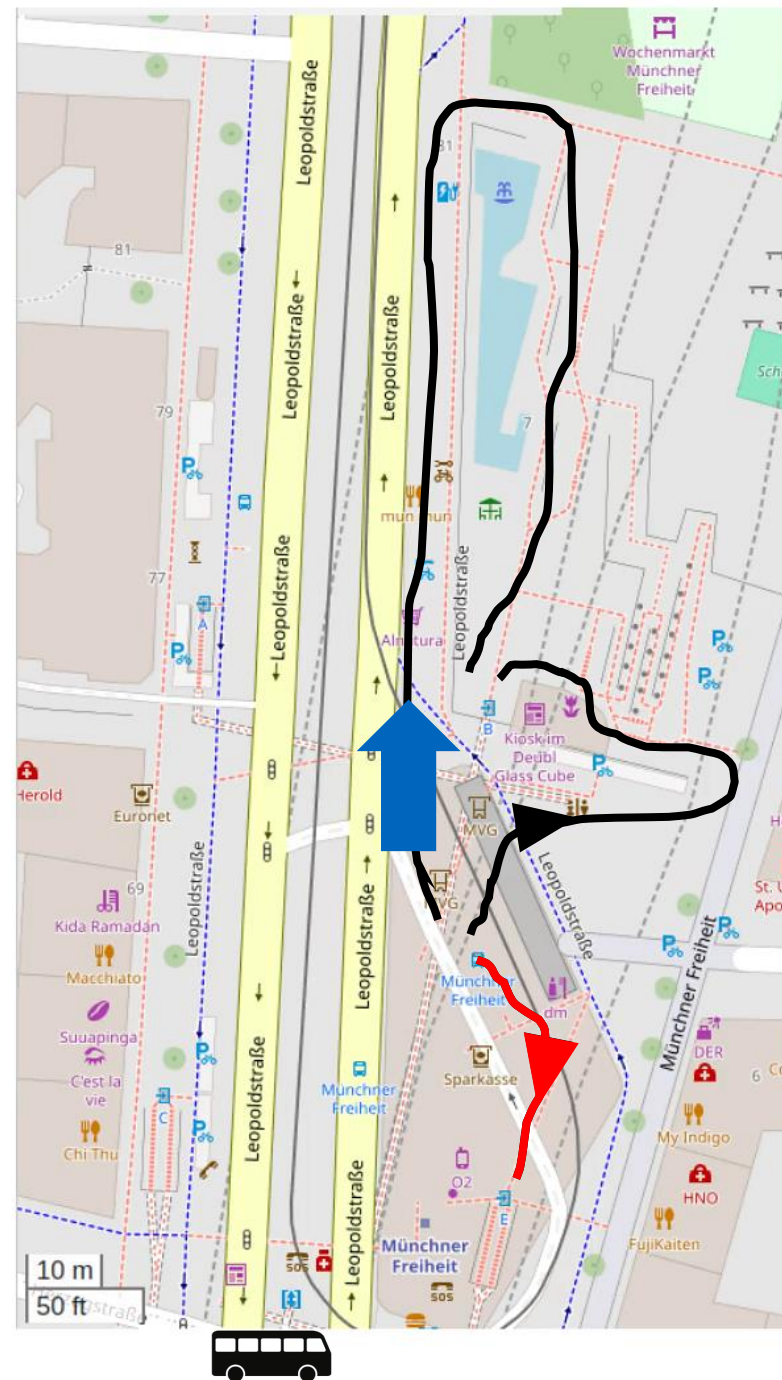




Image: Wolfram Schlenker,  
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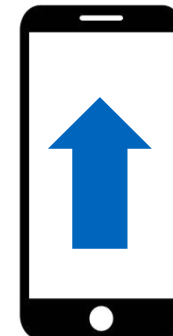


Long route

Metro station (surface level)  
Münchner Freiheit  
Munich, Germany

Medium route

Short route





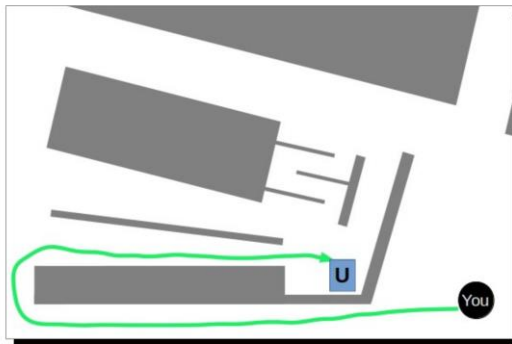
# Online survey [28]: testing the effect of three message elements

Top-down view

Appeal to fans' team spirit

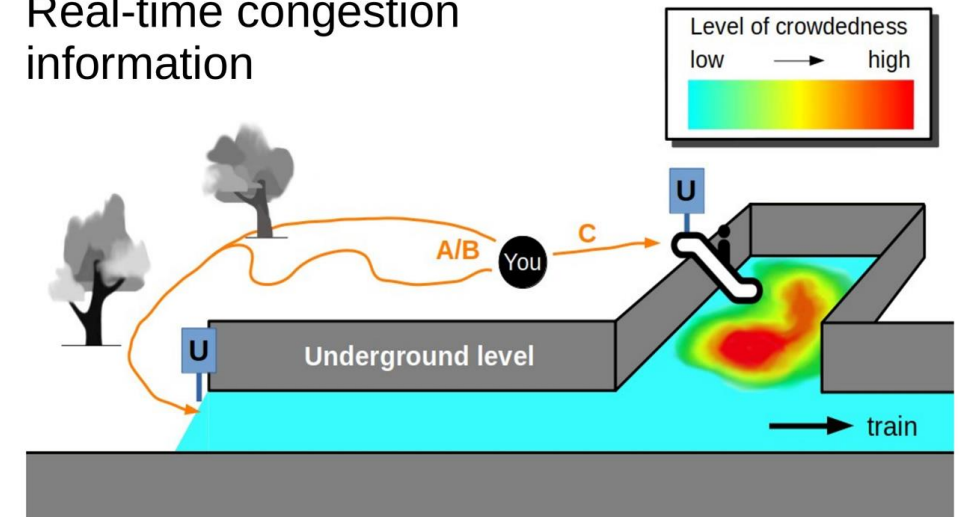
Congestion information

Please **use this route**  
to avoid congested areas.



Let's support **our team**  
by traveling safely.

Real-time congestion  
information



Which route  
should I take?



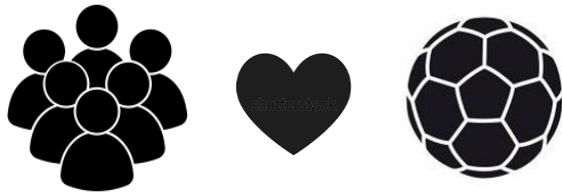
# Online survey [28]: design of the survey

The combination of the three elements leads to 8 message designs:

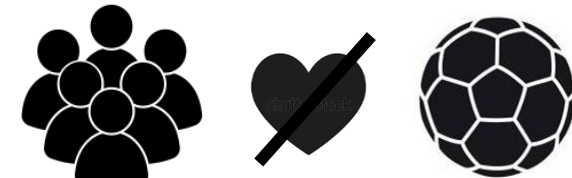


Assumption: fans share a social identity (the control group does not)

Fans 921 participants

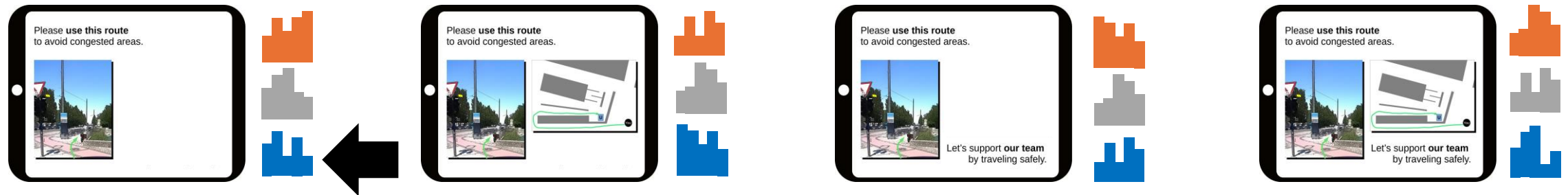


Control 444 participants

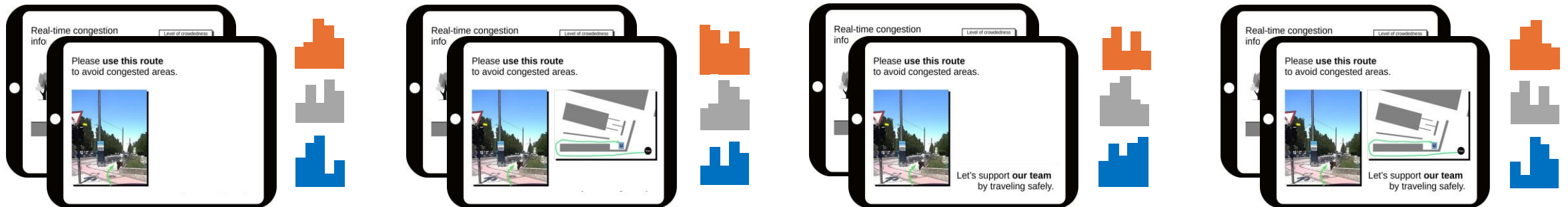


# “How likely is it that you take the short, medium and long route?”

Participants rated the attractiveness of the short (●), medium (●), and long (●) route (5-point Likert scale)



Kruskal-Wallis test



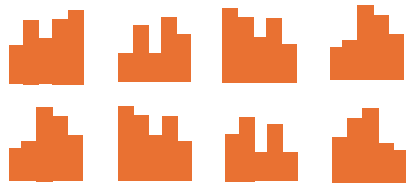


# There are differences in between message designs

Results of Kruskal-Wallis tests:

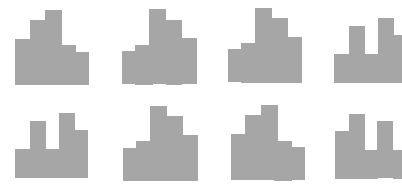
Fans:

Short route



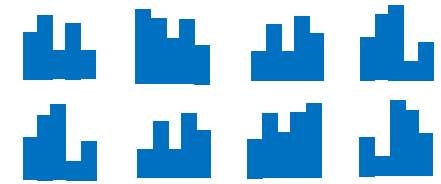
Significant difference ( $p < 0.05$ )

Medium route



Significant difference ( $p < 0.05$ )

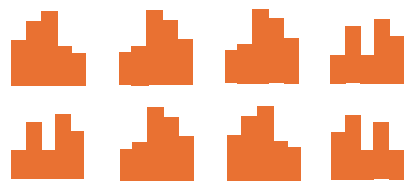
Long route



Significant difference ( $p < 0.05$ )

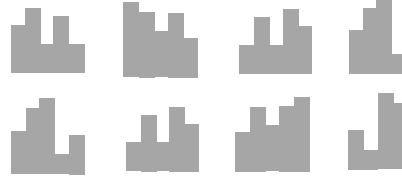
Control:

Short route



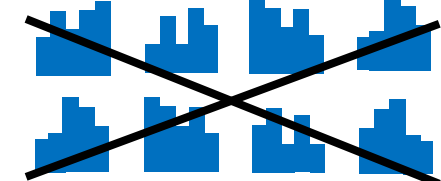
Significant difference ( $p < 0.05$ )

Medium route



Significant difference ( $p < 0.05$ )

Long route



# Appealing to fans' "team spirit" can foster compliance

Fans:

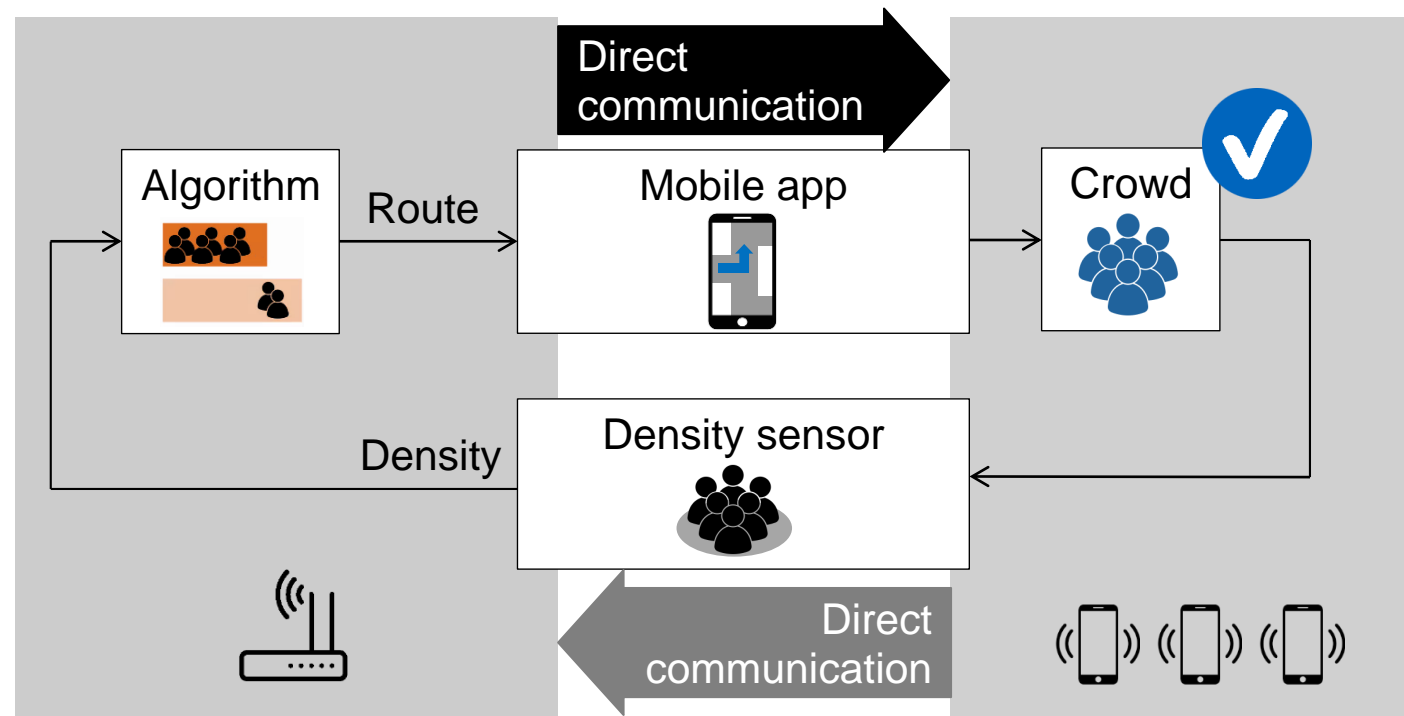
Analysis of all combinations:  
See my publication "Designing ..." [28]

Adding "team spirit" made the long route more attractive in one combination [27].



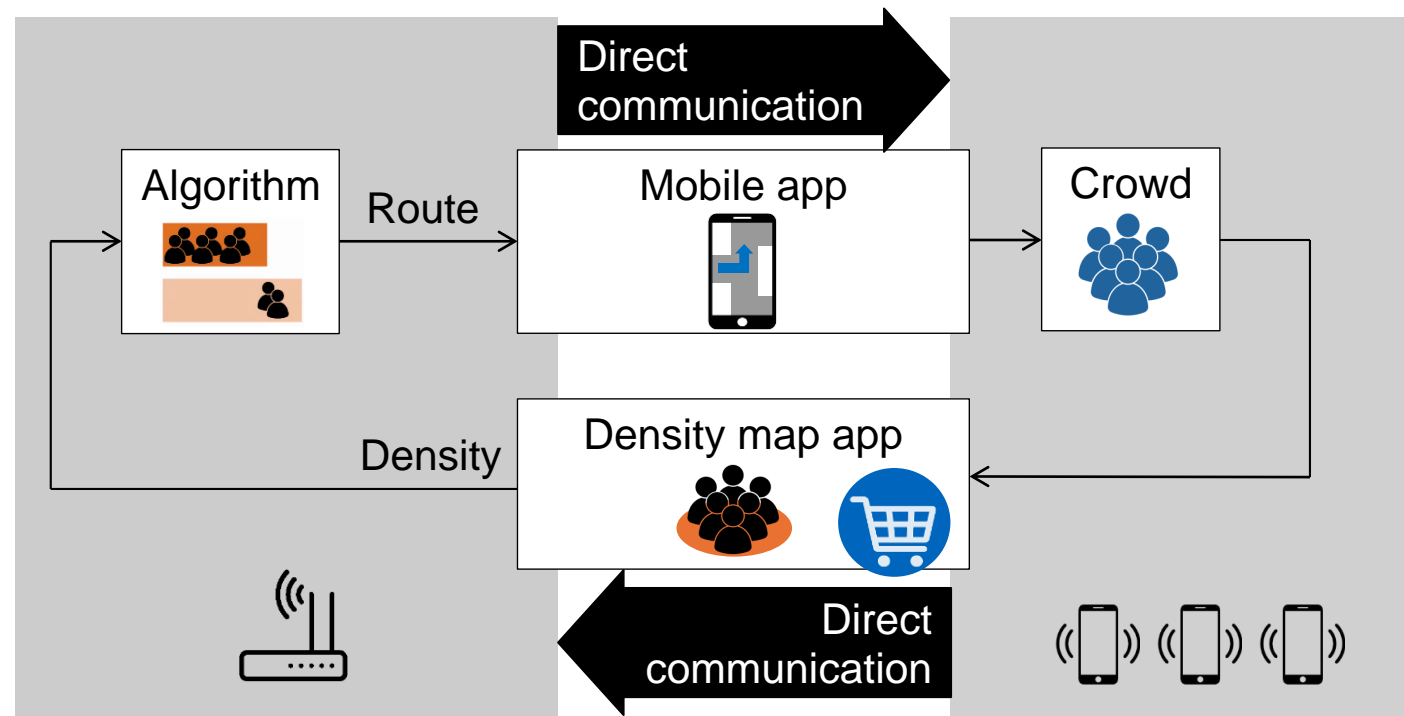
# There is no ideal message design

Additional result from the survey:  
Realistic route choice probabilities  
See my publication “Designing ...” [28]



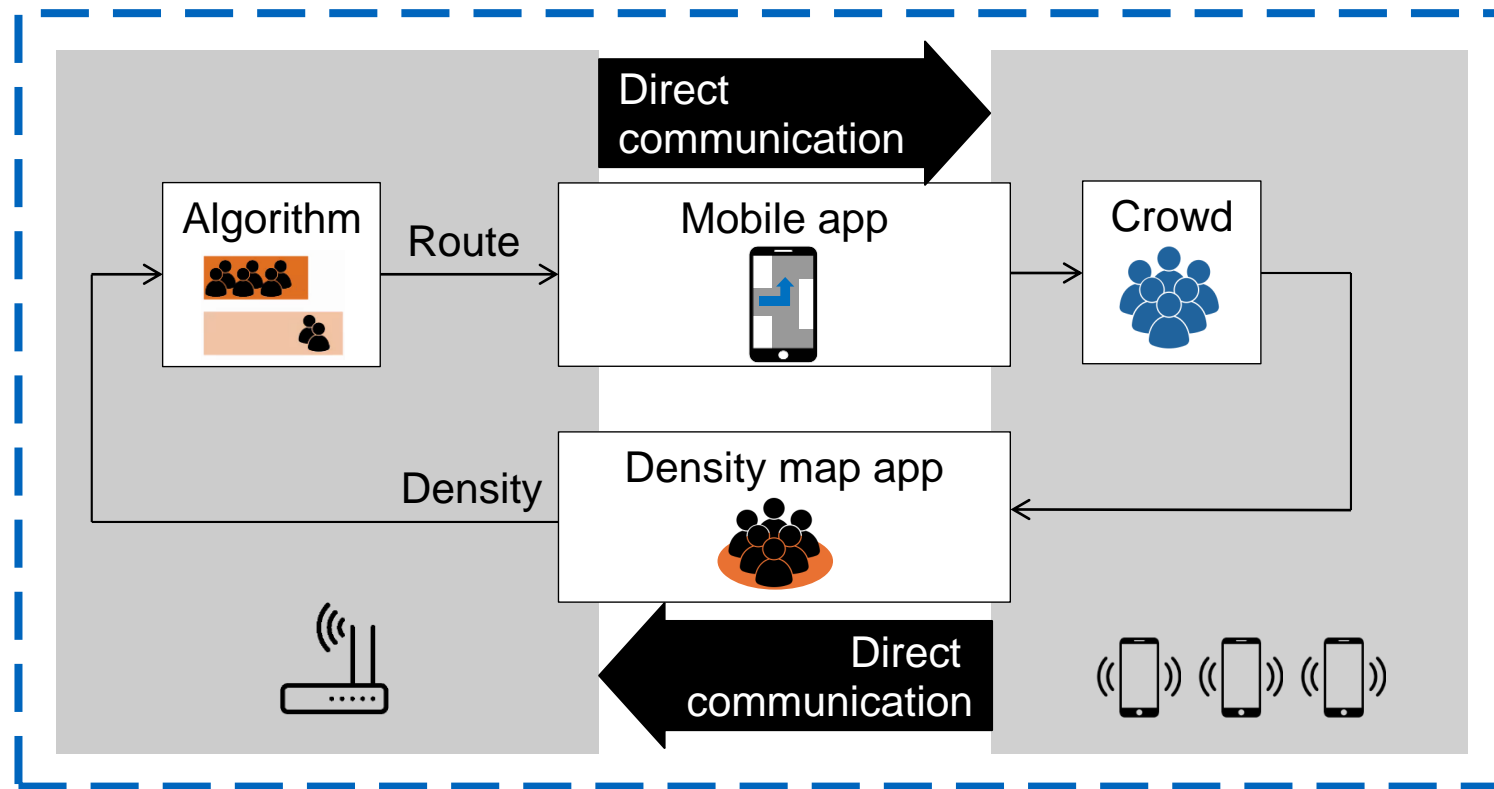
# Measuring densities using direct communication

I use the decentralized density map application (LTE sidelink, controlled mode) [28]:



# Can the proposed system resolve safety-critical congestion?

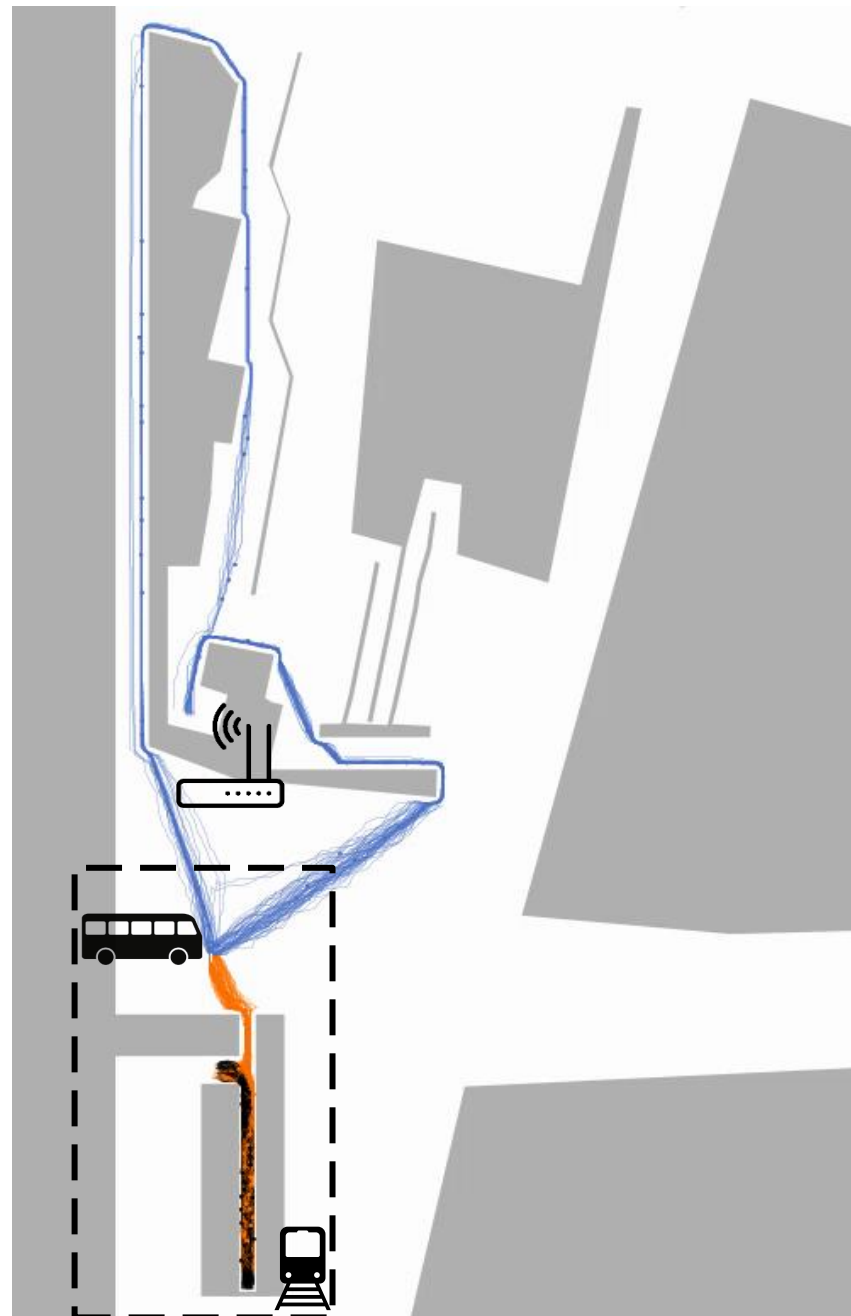
I model, implement and simulate the overall system in CrowNet:



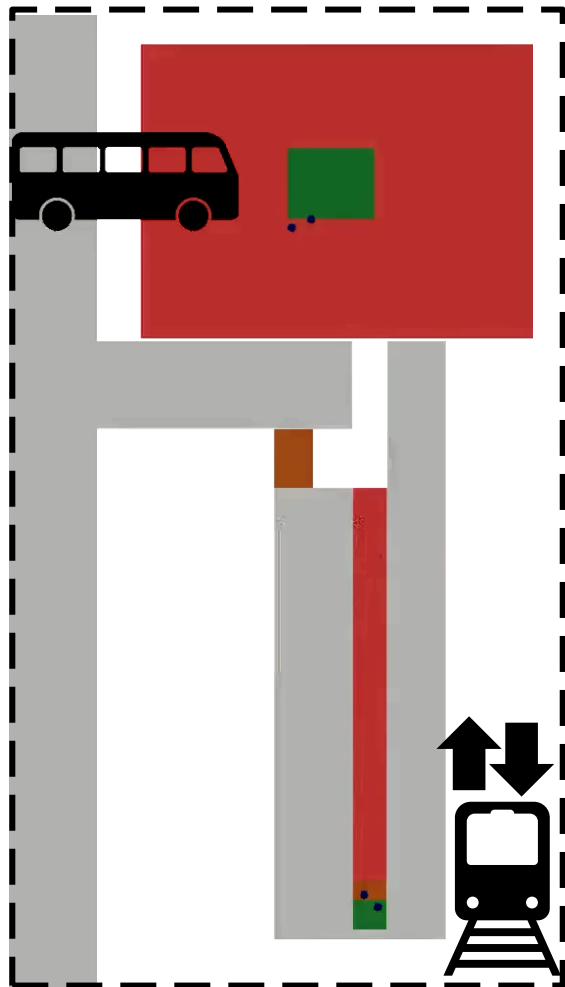
# Crowd simulation Münchner Freiheit Munich, Germany



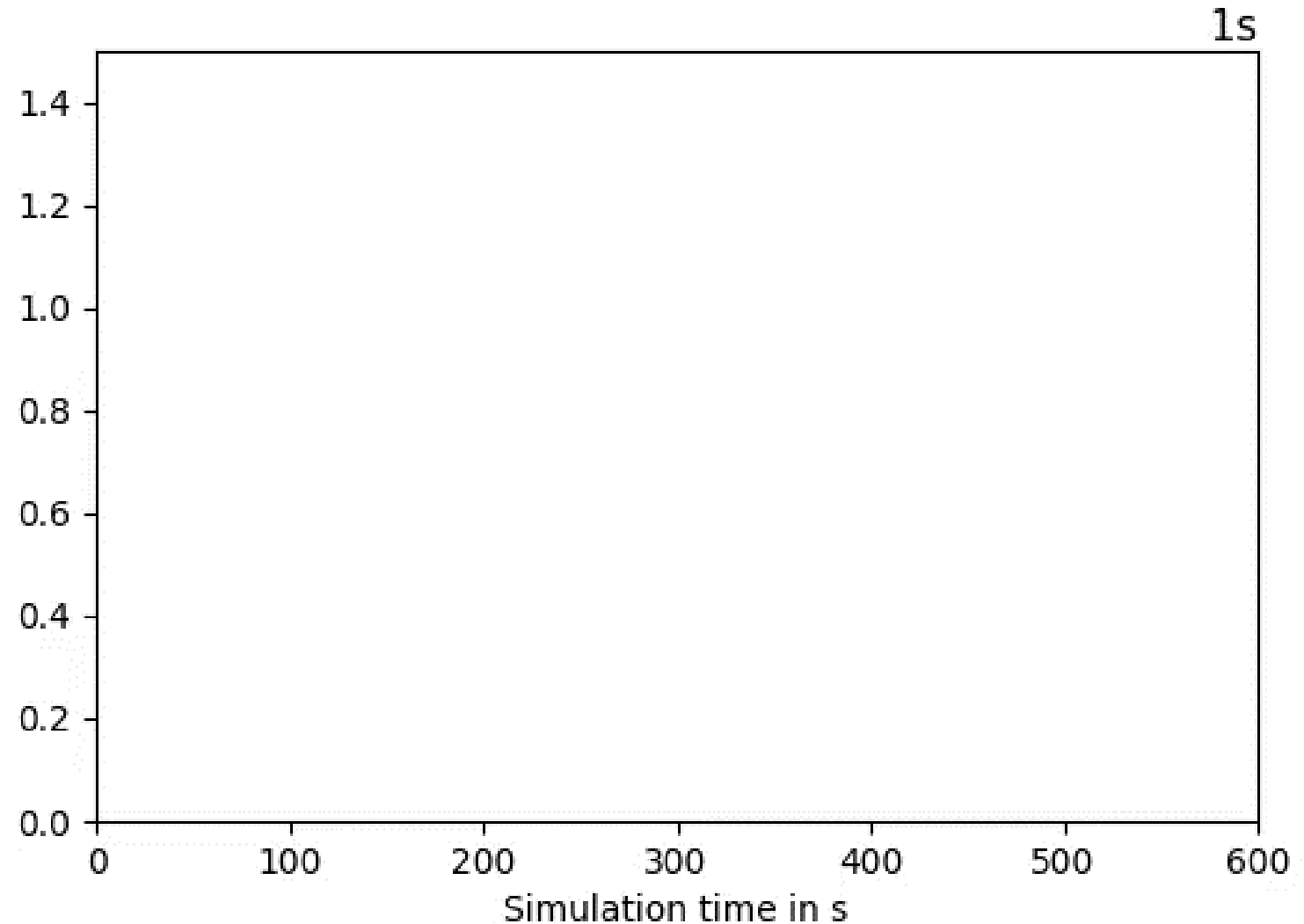
Image: Wolfram Schlenker,  
rights granted



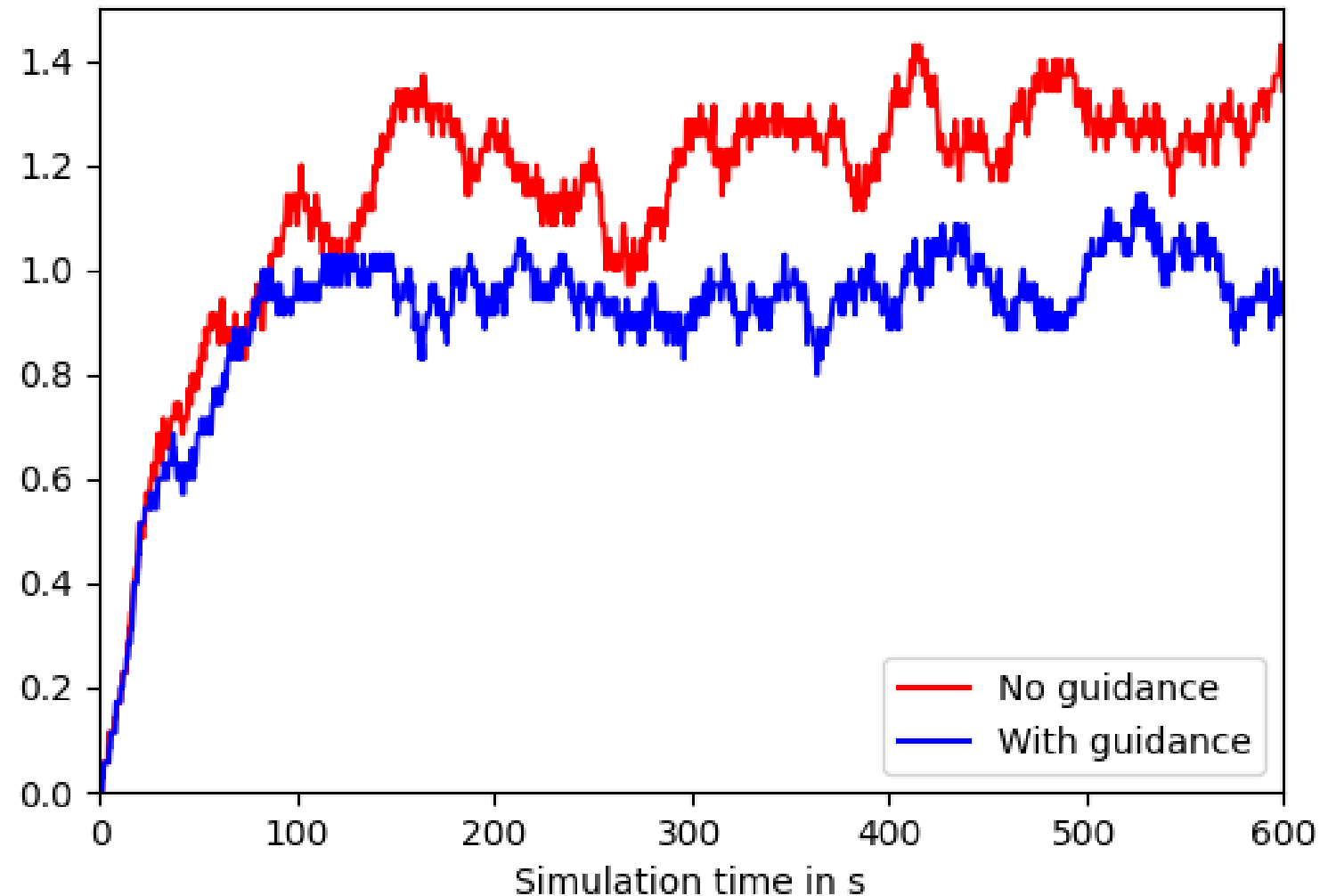
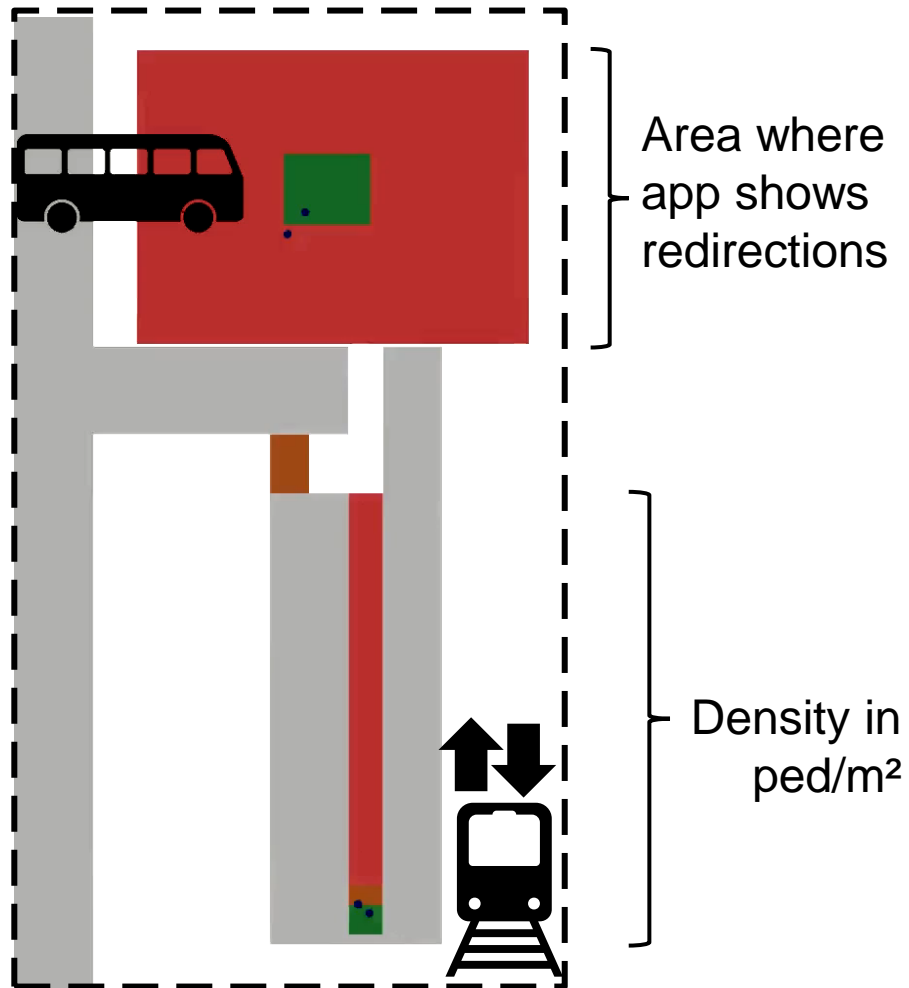
# Without guidance: congestion along the short route



Density in  
 $\text{ped/m}^2$

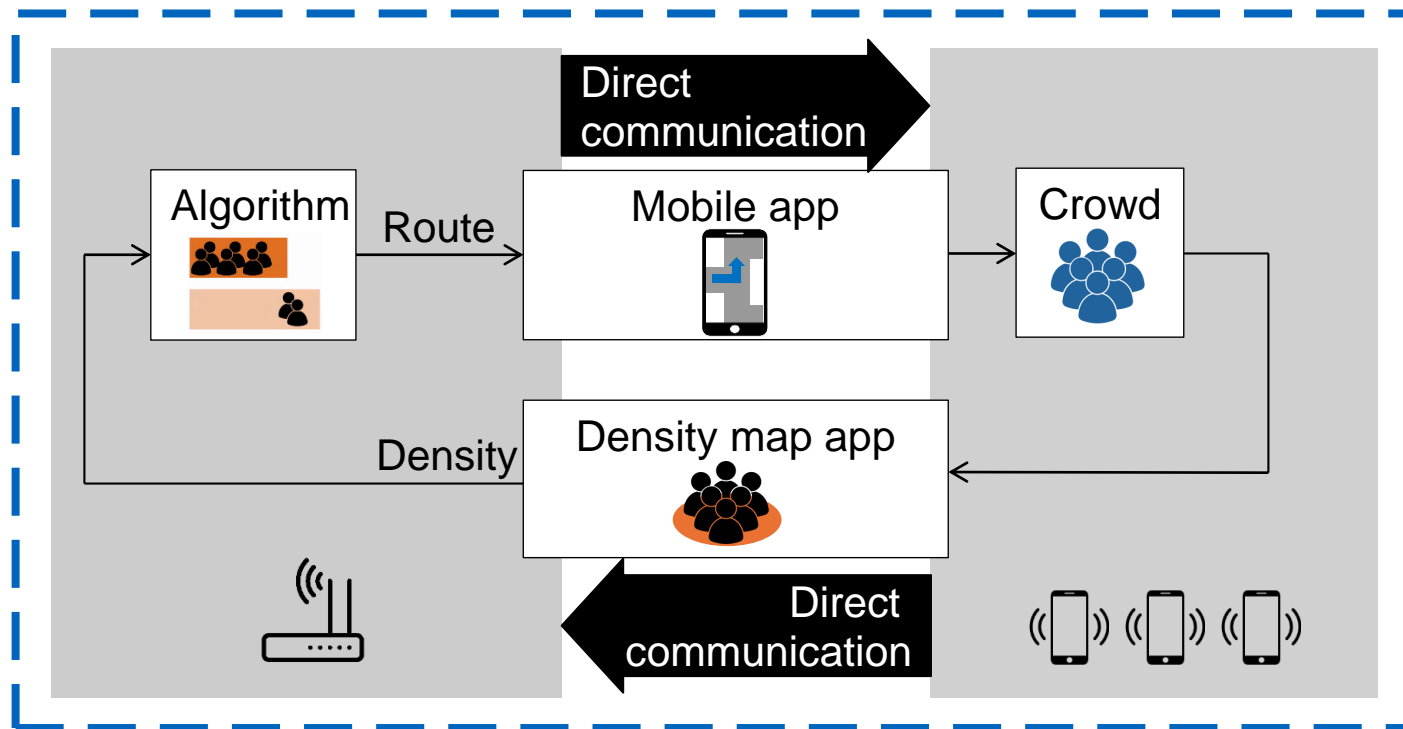


# The guidance system resolves safety-critical congestion

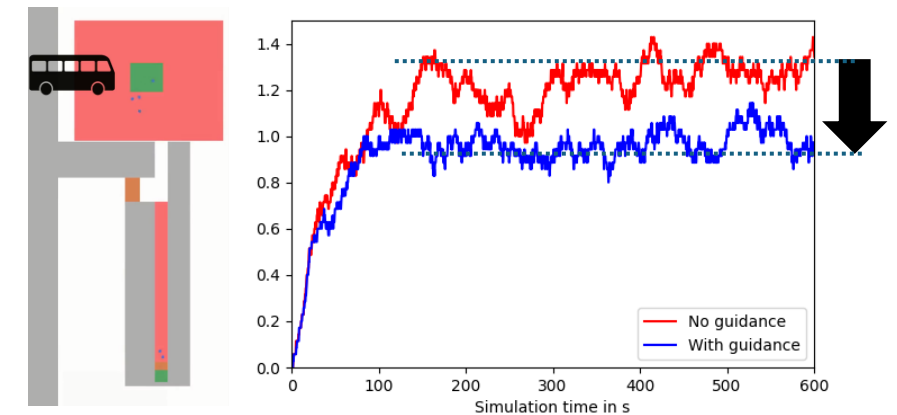




# How can crowds be redirected with mobile applications based on direct communication technology?



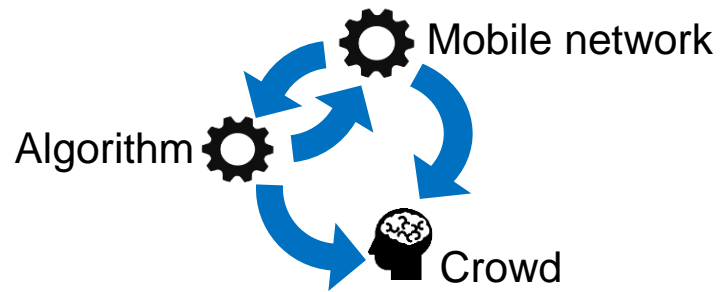
Proof of concept:






The system resolves safety-critical congestion.

# I modeled and simulated a novel crowd guidance system

## Novel socio-technical system

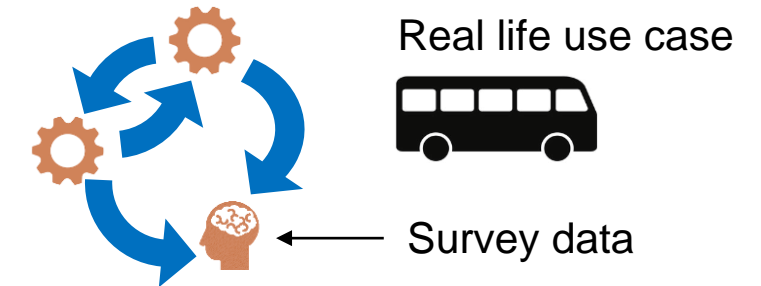


## Multi-method investigation

-  Algorithm  
*Modeling & Simulation*
-  Direct communication  
*Modeling & Simulation*
-  Crowd behavior  
*Survey*

See my publications [6,27,28]

## Proof of concept



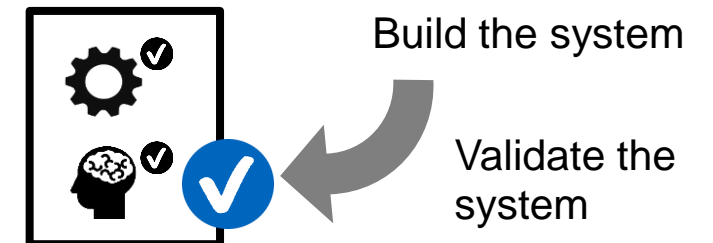
The system resolves congestion

## Novel simulator CrowNet



[github.com/roVer-HM/crownet](https://github.com/roVer-HM/crownet)

## Next step

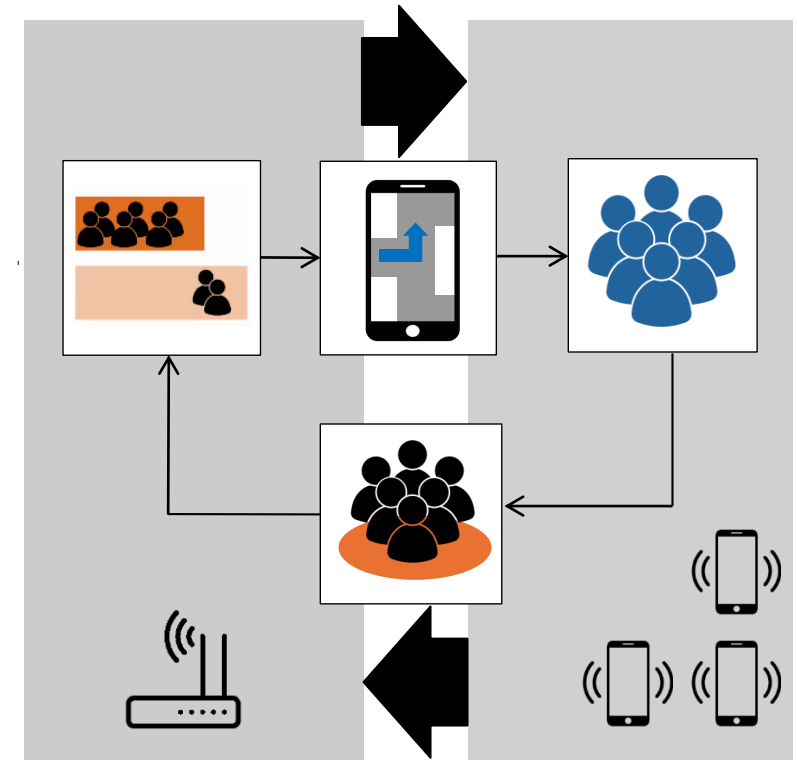


# Conclusion

A system was proposed that detects and redirects crowds through mobile applications.

It is possible to redirect crowds using mobile applications based on direct communication technology.

The proposed system can resolve safety-critical jams even when only a part of the crowd uses the technology.



# References (1/2)

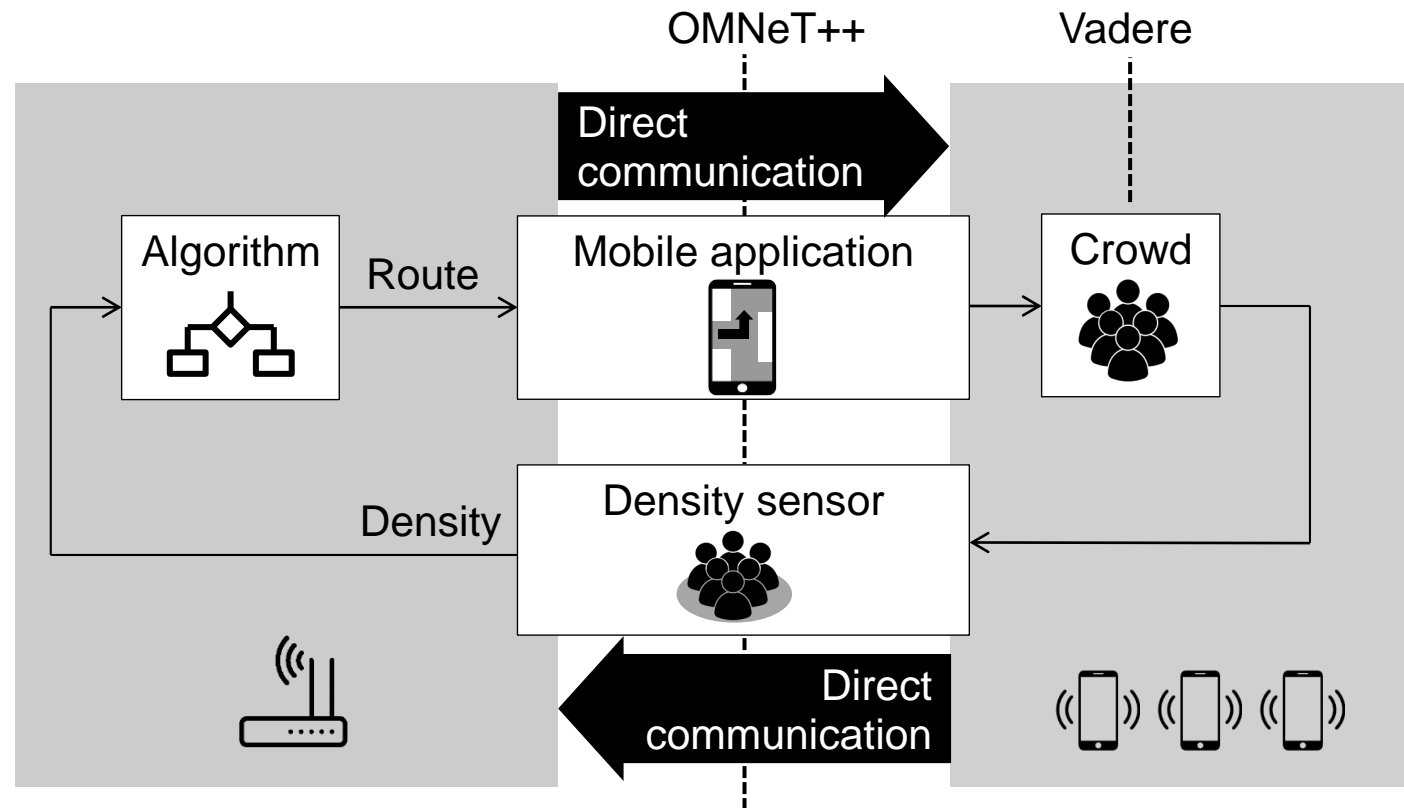
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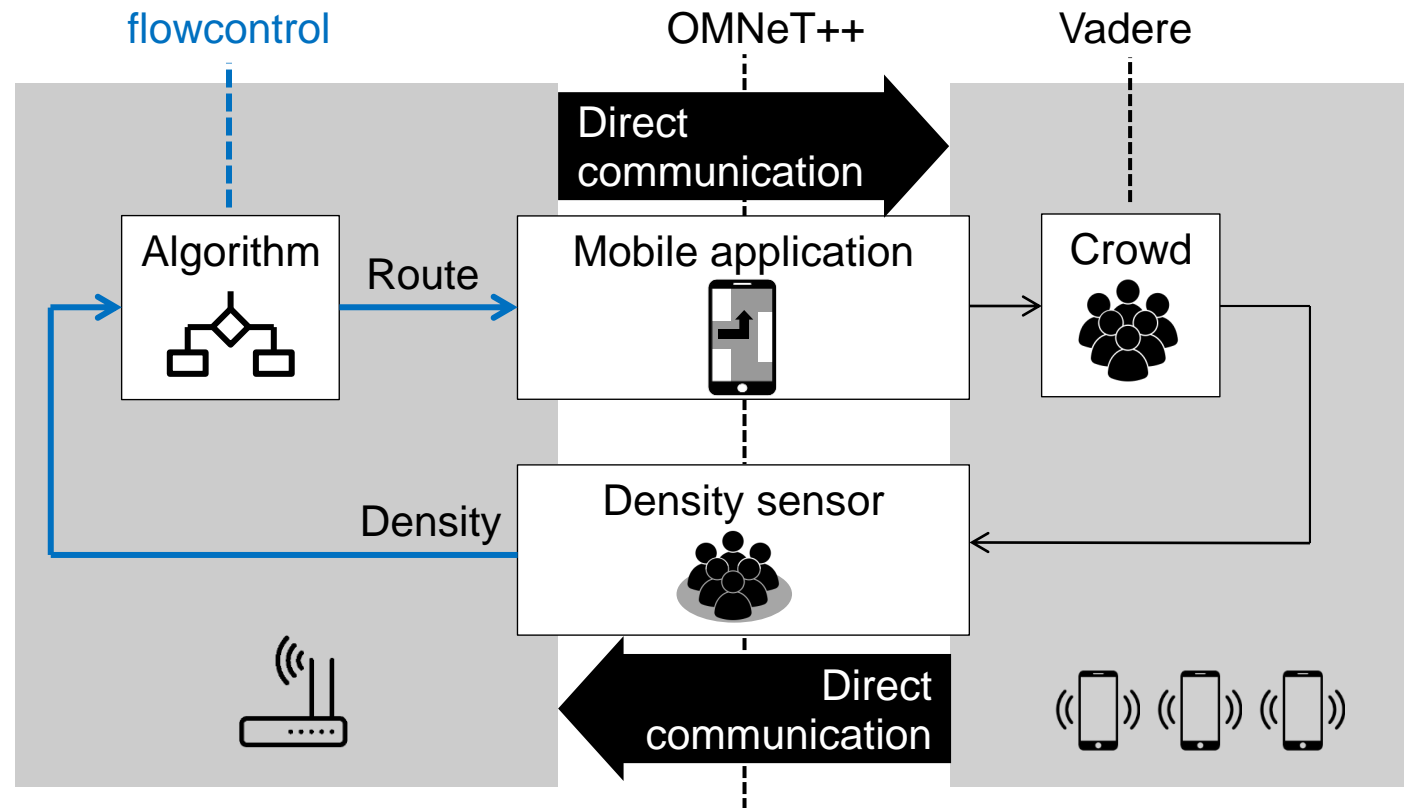
# CrowNet: a novel simulation framework

Initial simulator coupling [3]: Vadere [4] and OMNeT++ [5]



# My major contribution to CrowNet: flowcontrol

I developed flowcontrol [6] and integrated it:



# Algorithm study

Alternative algorithm

Parameter settings:

Route recommendation: every 2s

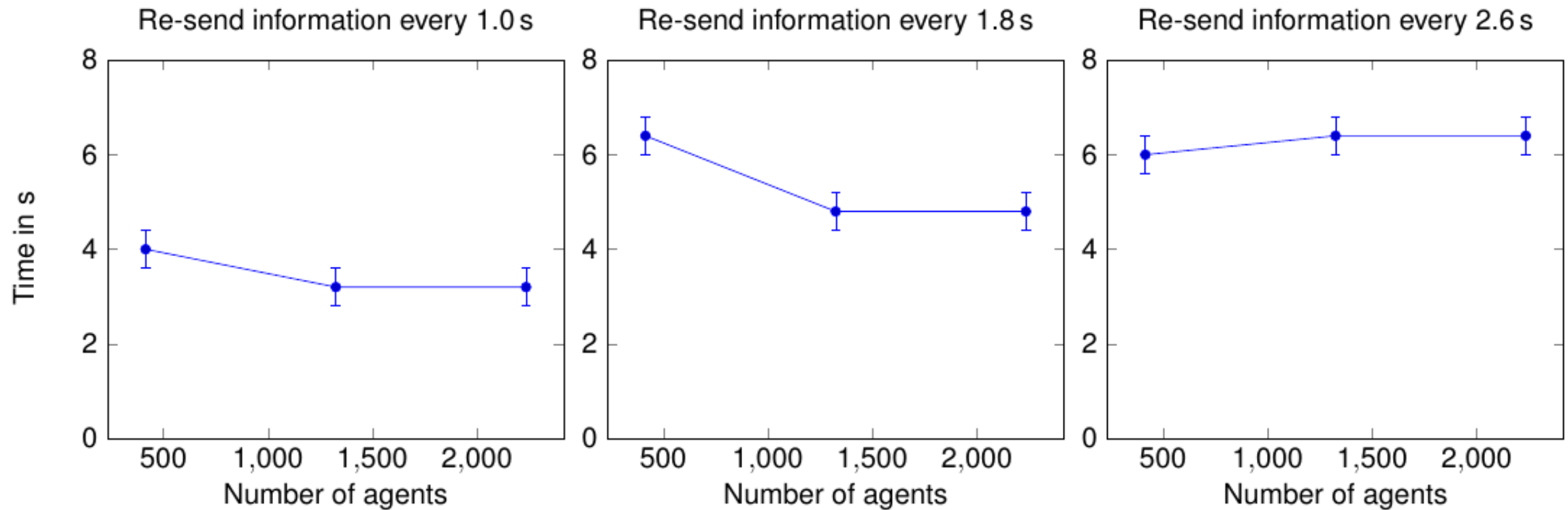
Corridor width = 2.5m

Inflow = 1.6ped/(ms) “8 agents every 2s” ( $= 30 \cdot 8 \text{ped} / 2.5\text{m} / 60\text{s}$ ) (4ped/s)



# Information dissemination study

It takes several seconds to distribute the information.



# Message design

Dropout: 44.51%

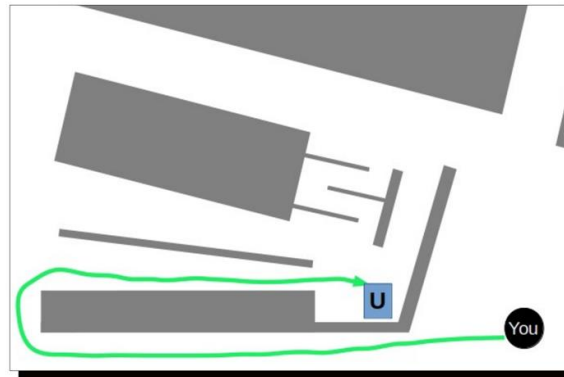
Number of participants who completed the survey: 444 (control), 921 (fans)

Group	<18	18-25	26-35	36-50	51-65	>65	n
Fans	0 %	17 %	38 %	34 %	10 %	1 %	921
Students and faculty associates	7 %	43 %	28 %	8 %	11 %	3 %	444

Table 4.8.: Age distribution of the two groups: *football fans* (1), and *students and faculty associates* (2). *Students and faculty associates* were younger than fans which might be explained by the fact that most of them were students.

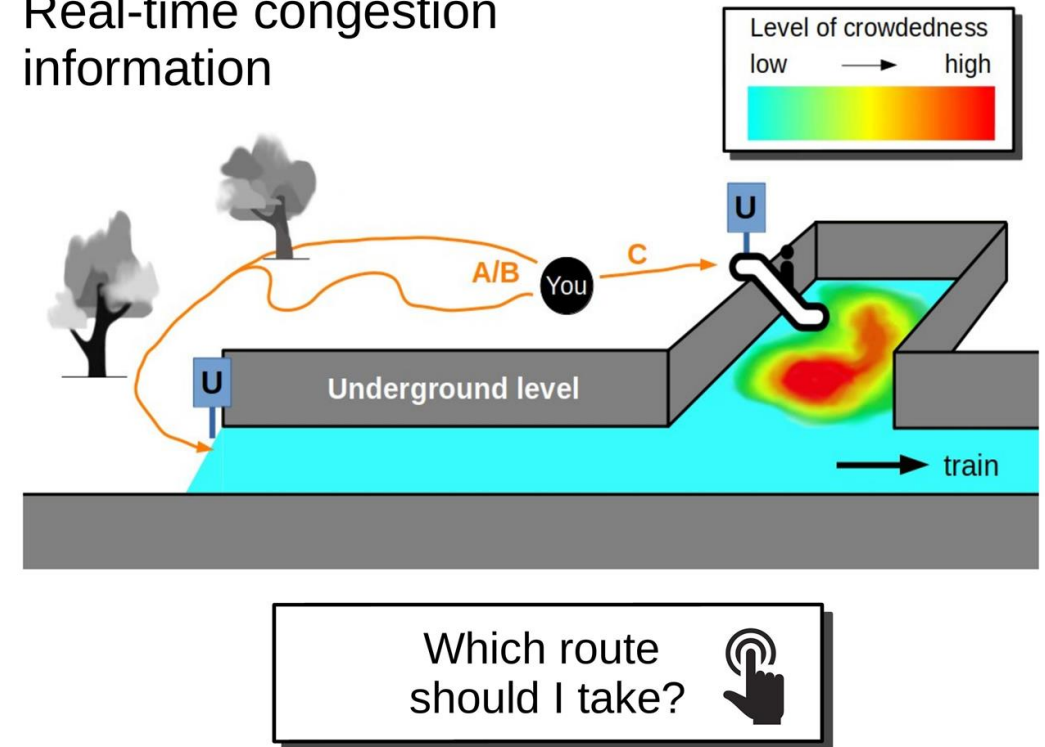
# Message design study

Please **use this route**  
to avoid congested areas.



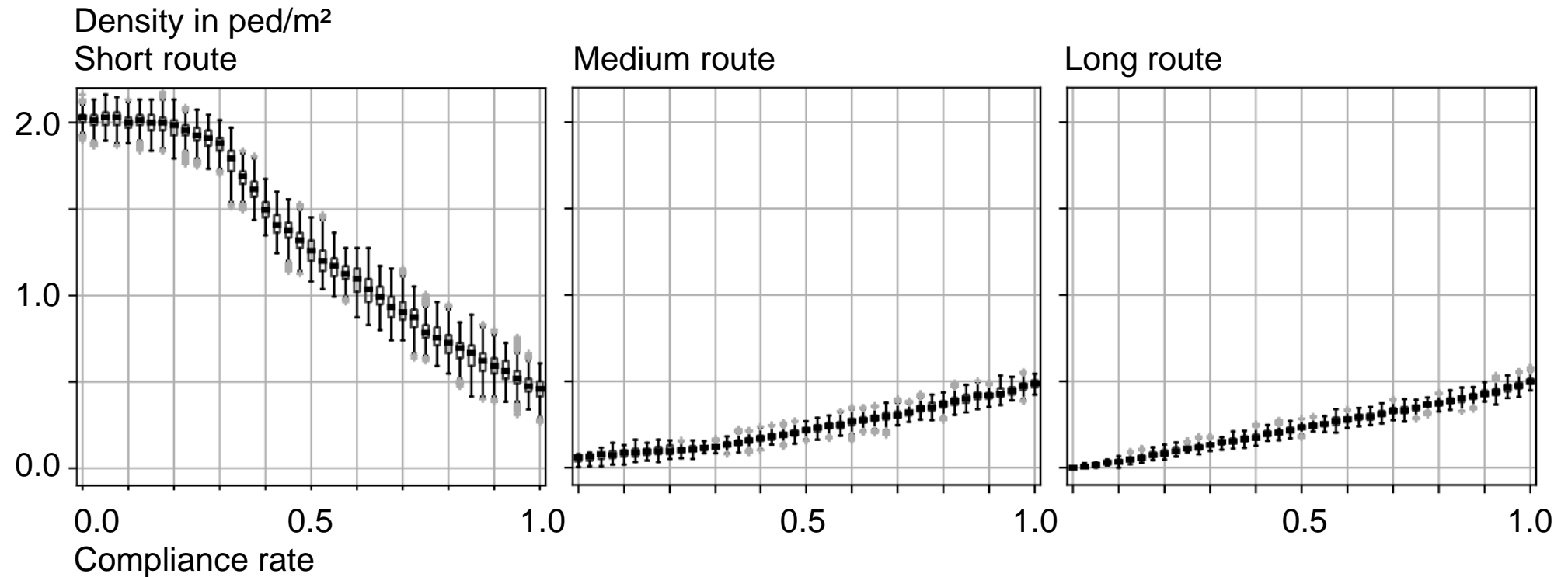
Let's support **our team**  
by traveling safely.

Real-time congestion  
information



# Algorithm study

Alternative algorithm

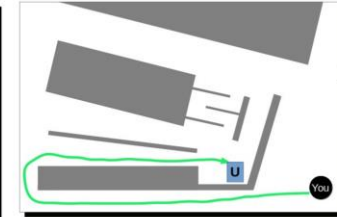


Please **use this route**  
to avoid congested areas.



Let's support **our team**  
by traveling safely.

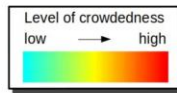
Please **use this route**  
to avoid congested areas.



Let's support **our team**  
by traveling safely.

Can appeal to fans' "team spirit" foster compliance? (see [27])

Real-time congestion  
information



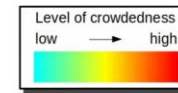
U

Please **use this route**  
to avoid congested areas.



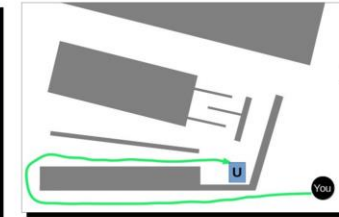
Let's support **our team**  
by traveling safely.

Real-time congestion  
information



U

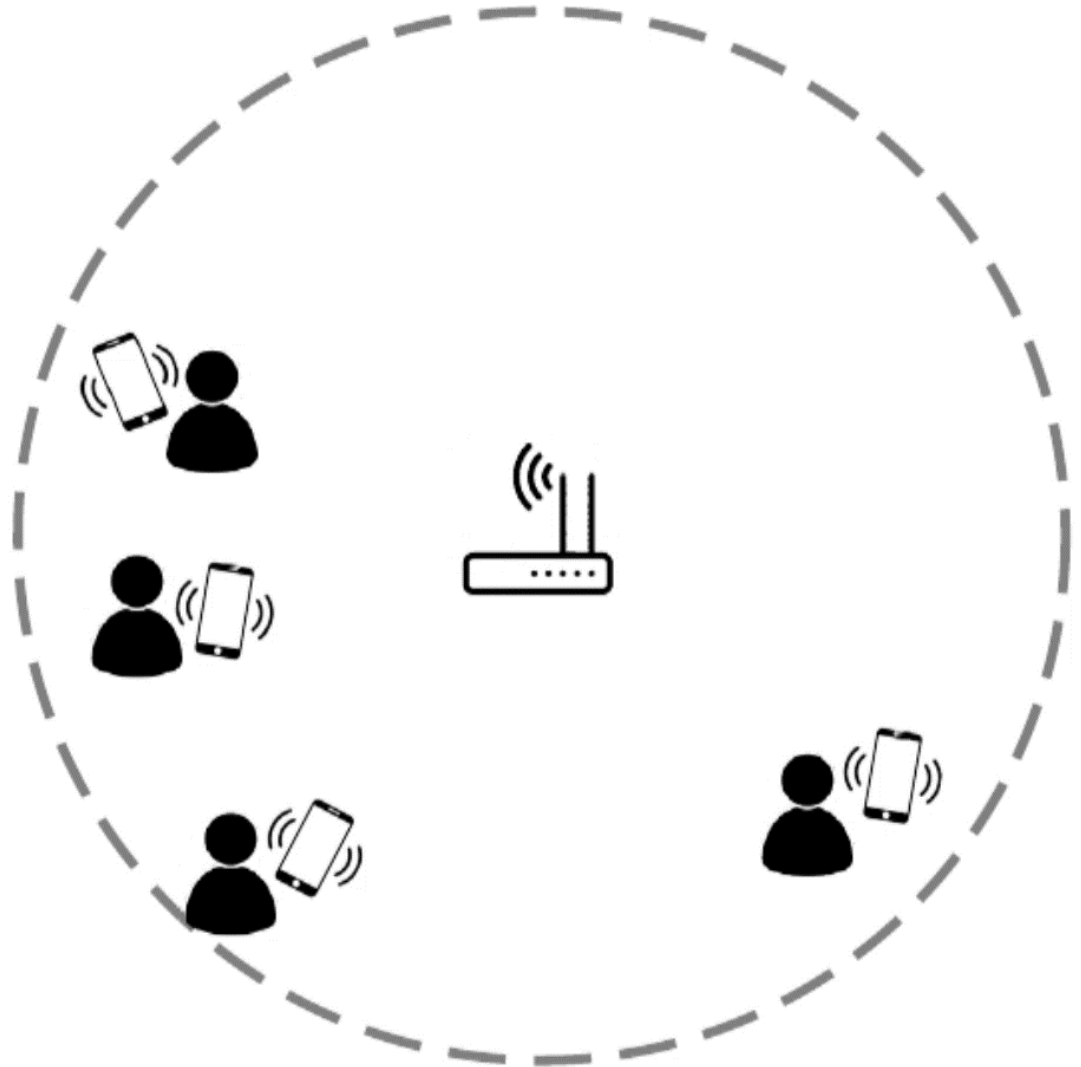
Please **use this route**  
to avoid congested areas.



Let's support **our team**  
by traveling safely.

# Density map application

LTE sidelink communication



# System test

Route recommendation: every 2s possible

Short corridor: Corridor width = 1.75m

Inflows:

Bus arrivals: 60peds/min

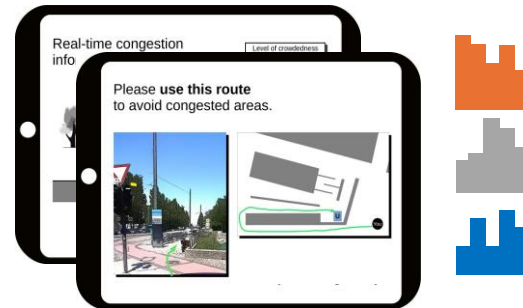
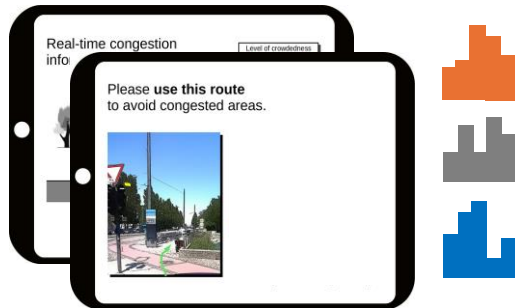
Counterflow: 40peds/min

Route distributions without recommendations: 49% short, 30% medium, 22% long

Route distribution when the long route is recommended: 25% short, 35% medium, 40% long

# Participants ranked the attractiveness of the 3 routes

5-point scale





# Kruskal Wallis test

**H<sub>0</sub>: The mean ranks ( ~ “medians”) are equal across 3+ populations.**

**The smaller the p value, the more likely the null hypothesis must be rejected.**

**“ p < 0.05 “ -> reject H<sub>0</sub> -> “The mean ranks are equal” is false -> difference**

**“ p >= 0.05 “ -> confirm H<sub>0</sub> -> “The mean ranks are equal” is true -> no difference**

The Kruskal–Wallis test by ranks “one-way ANOVA on ranks [1]”

- non-parametric method
- testing whether samples originate from the same distribution
- extends the Mann–Whitney U test

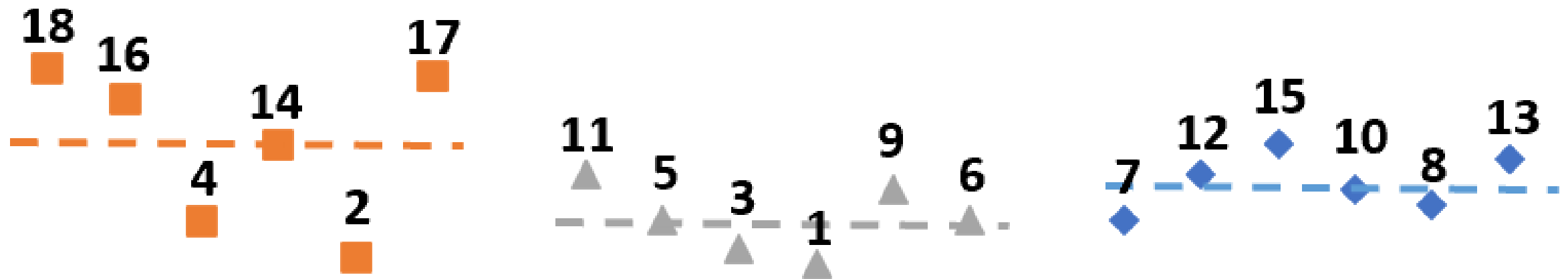
Assumptions:

- It is used for comparing two or more independent samples
- equal or different sample sizes.

$$H = (N - 1) \frac{\sum_{i=1}^g n_i (\bar{r}_{i\cdot} - \bar{r})^2}{\sum_{i=1}^g \sum_{j=1}^{n_i} (r_{ij} - \bar{r})^2}, \text{ where}$$

- $N$  is the total number of observations across all groups
- $g$  is the number of groups
- $n_i$  is the number of observations in group  $i$
- $r_{ij}$  is the rank (among all observations) of observation  $j$  from group  $i$
- $\bar{r}_{i\cdot} = \frac{\sum_{j=1}^{n_i} r_{ij}}{n_i}$  is the average rank of all observations in group  $i$
- $\bar{r} = \frac{1}{2}(N + 1)$  is the average of all the  $r_{ij}$ .

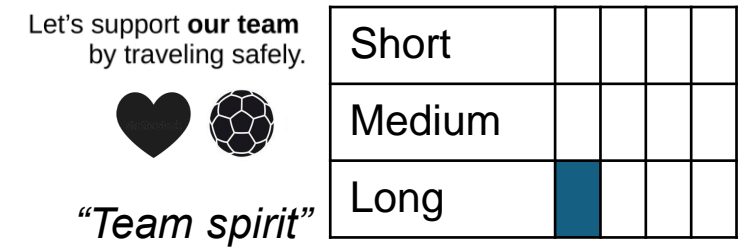
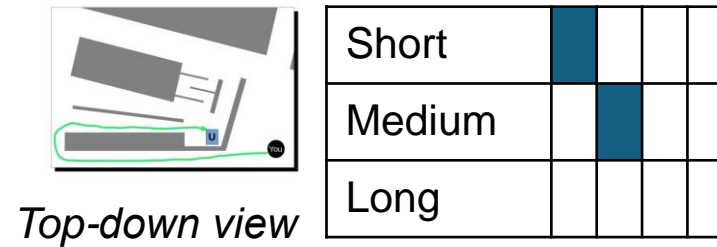
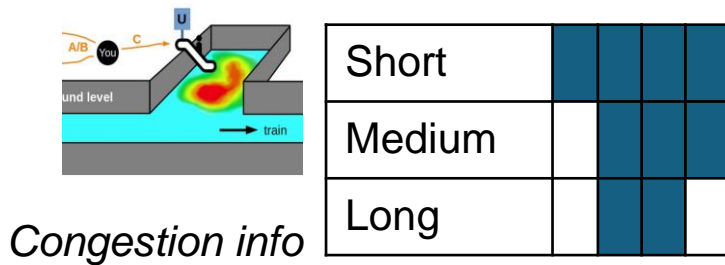
H<sub>0</sub>: The mean ranks are equal across 3+ populations.



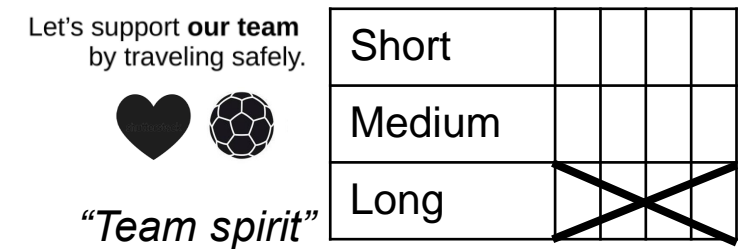
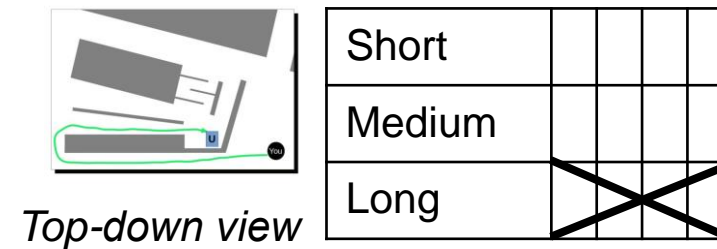
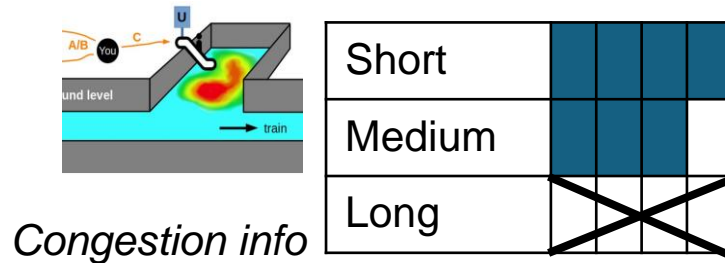
# There is no ideal message design

Results of the Mann-Whitney U tests: ■ p-Value < 0.05

## Fans



## Control group



Gruppe	Reaktionszeit	Rang	Rangsummen:	Mittlere Rangsumme:
Gruppe A	34	2	$R_A = 2 + 4 + 7 + 9 = 22$	$\bar{R}_A = 22 / 4 = 5,5$
Gruppe A	36	4		
Gruppe A	41	7		
Gruppe A	43	9		
Gruppe B	44	10	$R_B = 10 + 5 + 11 + 1 = 27$	$\bar{R}_B = 27 / 4 = 6,75$
Gruppe B	37	5		
Gruppe B	45	11		
Gruppe B	33	1		
Gruppe C	35	3	$R_C = 3 + 6 + 8 + 12 = 29$	$\bar{R}_C = 29 / 4 = 7,25$
Gruppe C	39	6		
Gruppe C	42	8		
Gruppe C	46	12		
		$E_R = \frac{n+1}{2} = \frac{12+1}{2} = 6,5$		

Wir haben bei zwölf Personen die Reaktionszeit gemessen, daher ist die Anzahl der Fälle zwölf. Die Freiheitsgrade ergeben sich durch die Anzahl der Gruppen minus eins, also haben wir zwei Freiheitsgrade.

#### Anzahl der Fälle

$$n = 12$$

#### Freiheitsgrade

$$df = 2$$

#### Varianz von Rängen

$$\sigma_R^2 = \frac{n^2 - 1}{12} = \frac{12^2 - 1}{12} = 11,92$$

#### Erwartungswert der Rangplätze

$$E_R = 6,5$$

#### Mittlere Rangsummen:

$$\bar{R}_A = 22 / 4 = 5,5$$

$$\bar{R}_B = 27 / 4 = 6,75$$

$$\bar{R}_C = 29 / 4 = 7,25$$

Prüfgröße H  entspricht  $\chi^2$

$$H = \frac{n-1}{12} \cdot \sum_{i=1}^k \frac{n_i (\bar{R}_i - E_R)^2}{\sigma_R^2}$$

$$H = \frac{12-1}{12} \cdot 4 \cdot \frac{(5,5-6,5)^2 + (6,75-6,5)^2 + (7,25-6,5)^2}{11,92}$$

$$= 0,5$$

Nachdem der H-Wert bzw. der Chi-Quadrat Wert berechnet worden, kann der kritische Chi-Quadrat Wert aus der [Tabelle der kritischen Chi-Quadrat-Werte](#) abgelesen werden.

#### Chi-Quadrat Tabelle

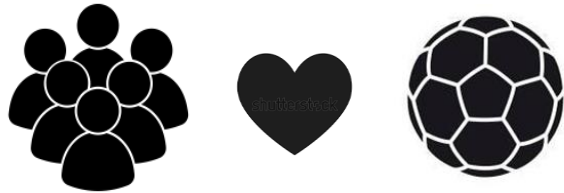
Signifikanzniveau Alpha	0,995	0,975	0,2	0,1	0,05	0,025	0,02	0,01	0,005
Freiheitsgrade									
1	0	0,001	1,642	2,706	3,841	5,024	5,412	6,635	7,879
2	0,01	0,051	3,219	4,605	5,991	7,378	7,824	9,21	10,597
3	0,072	0,216	4,642	6,251	7,815	9,348	9,837	11,345	12,838
4	0,207	0,484	5,989	7,779	9,488	11,143	11,668	13,277	14,86
5	0,412	0,831	7,289	9,236	11,07	12,833	13,388	15,086	16,75

Bei einem Signifikanzniveau von 5% ist der kritische Chi-Quadrat Wert daher 5,991. Dieser kritische Wert ist also größer als der berechnete Chi-Quadrat- bzw. H-Wert. Somit wird die Nullhypothese beibehalten und es gibt keinen Unterschied in der Reaktionszeit in den drei Gruppen.

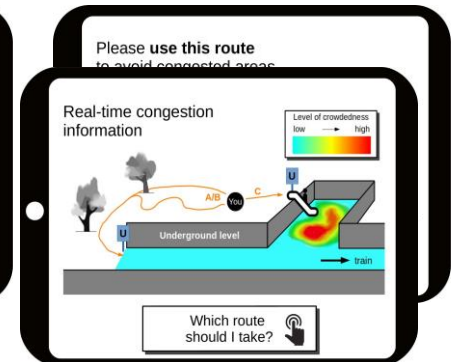
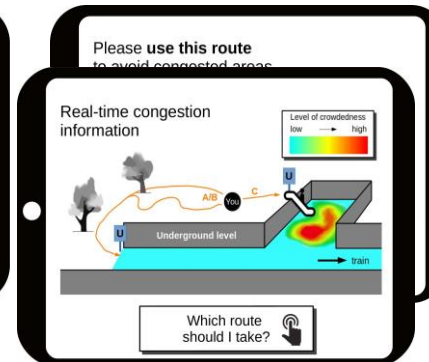
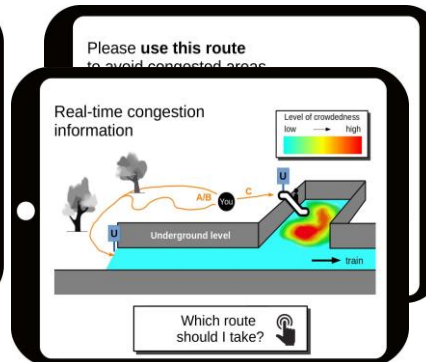
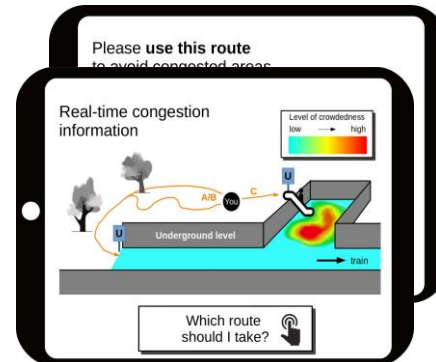
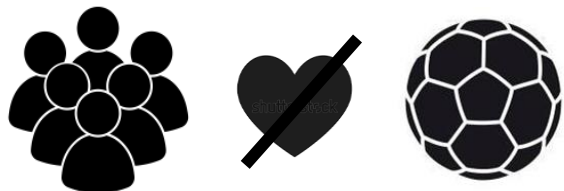
# Online survey [28]: football fans and control group, 8 designs

Assumption: fans share a social identity (the control group does not)

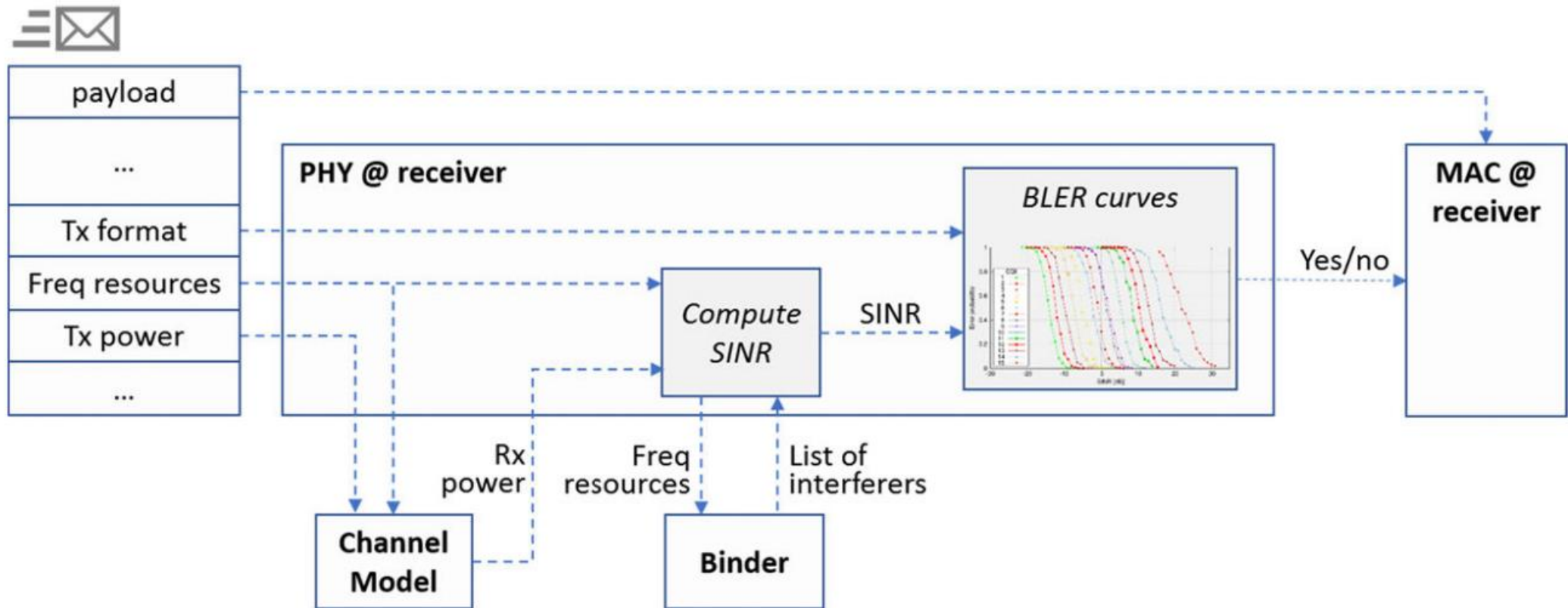
Fans 921 participants



Control 444 participants



# simu5G: model structure



## Resource Blocks (RBs)

- Starting from the transmitted power at the sender, it applies a *channel model* to compute the received power. A channel model can be configured to incorporate fading, shadowing, pathloss, etc., and can be made arbitrarily complex. Simu5G comes with a default channel model called *Realistic Channel Model*, which is compliant with the 3D model described in [19].
- On each RB occupied by the TB, it computes the SINR as  $SINR = P_{RX} / \left( \sum_j P_{RX}^j + R \right)$ , where  $P_{RX}$  is the received signal power,  $P_{RX}^j$  is the power received from the  $j$ -th interferer and  $R$  is the Gaussian noise. The set of indexes  $j$  is computed by querying the Binder to know which other nodes were using the same RB. For each interferer, the received power is computed by applying the channel model, starting from the transmission power.
- Then, it uses Block Error Rate (**BLER**) curves to compute the reception probability for each RB composing the ongoing transmission. **BLER** curves can be obtained from a link simulator or from 3GPP documents. This makes it possible to translate a SINR and a transmission format to a probability of correct reception of an RB. More specifically, the `error()` function considers the **BLER** curve related to the MCS used in transmission, at the abscissa represented by the measured SINR, and it obtains an error probability for that RB, call it  $P_{err}$ .
- Finally, a uniform random variable  $X \in [0; 1]$  is sampled and the *AirFrame* is assumed to be corrupted if  $X < 1 - \prod_i (1 - P_{err}^i)$ , and correct otherwise.